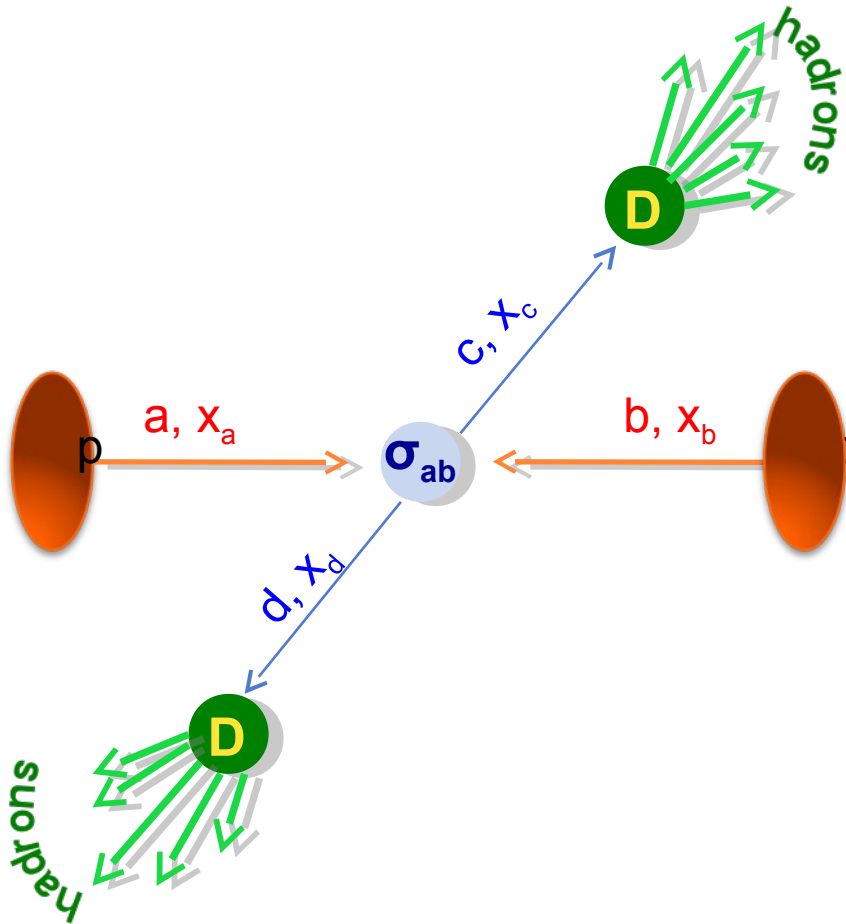


# Bias and background

Christine Nattrass

RHIC/AGS User's Meeting 2016

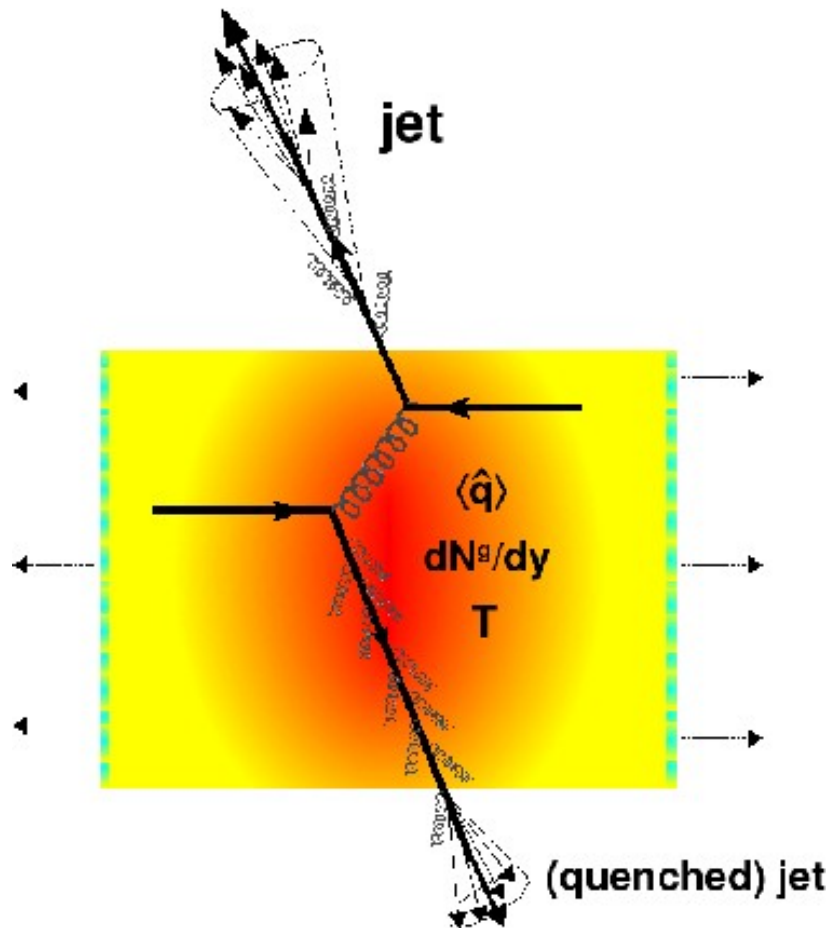
# Jets in principle



- Jet measures **partons**
- Hadronic degrees of freedom are integrated out
- Algorithms are **infrared and collinear safe**



# Quenched jets: what we're trying to study



- Quenched jet
  - Softer constituents
  - Broader radius
- → Looks more like background

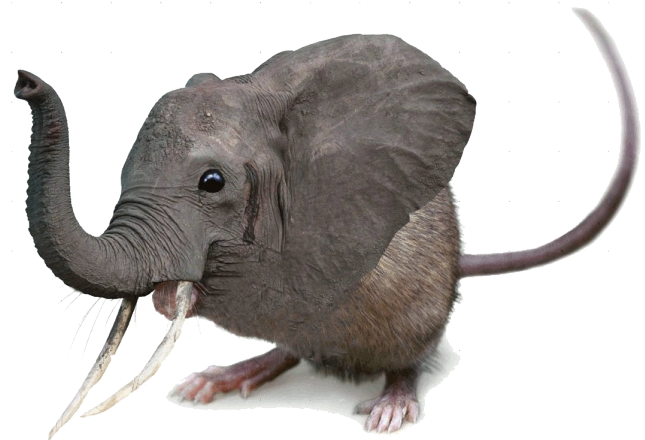


Figure from Nucl.Phys. A827 (2009) 356C-364C arXiv:0902.2488 [nucl-ex]

# Background: our white elephant

Wiki: “A **white elephant** is a possession which its owner cannot dispose of and whose cost, particularly that of maintenance, is out of proportion to its usefulness. The term derives from the story that the kings of Siam, now Thailand, were accustomed to make a present of one of these animals to courtiers who had rendered themselves obnoxious, in order to ruin the recipient by the cost of its maintenance.”

- Background properties
- Impact of background subtraction/suppression on reconstructed jets
- Background subtraction in jet-h and h-h correlations

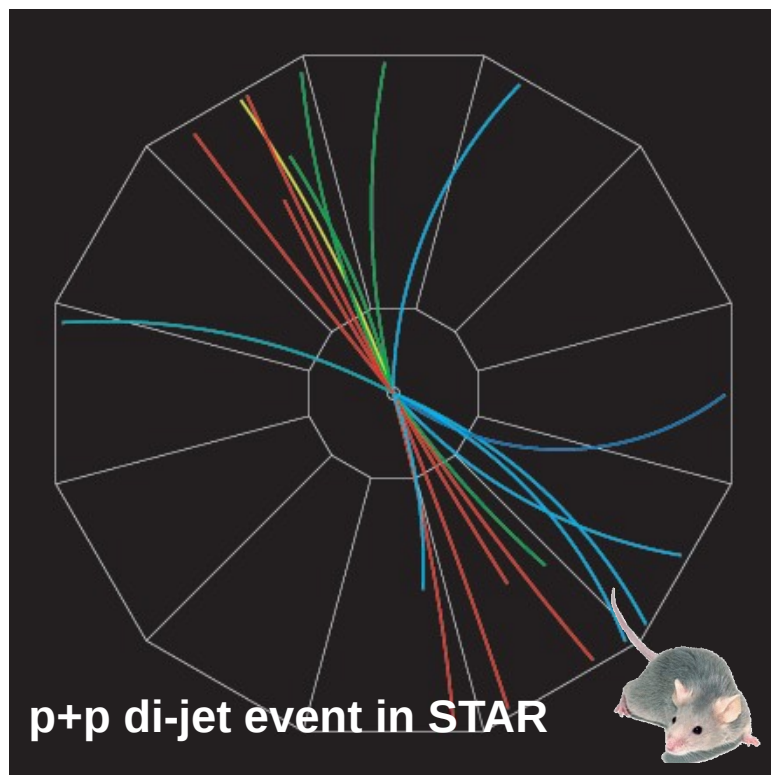




Properties of the background

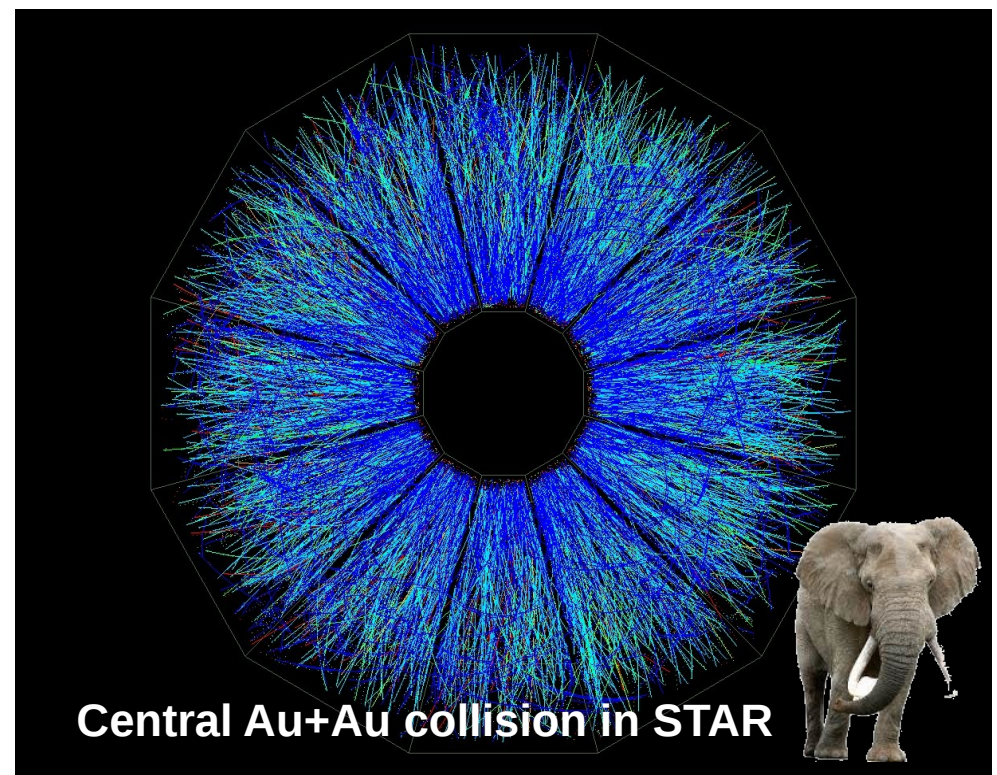






## Signal

- Harder
- Correlated with rxn plane
- Low  $p_T$  modifications
- Flavor modifications?

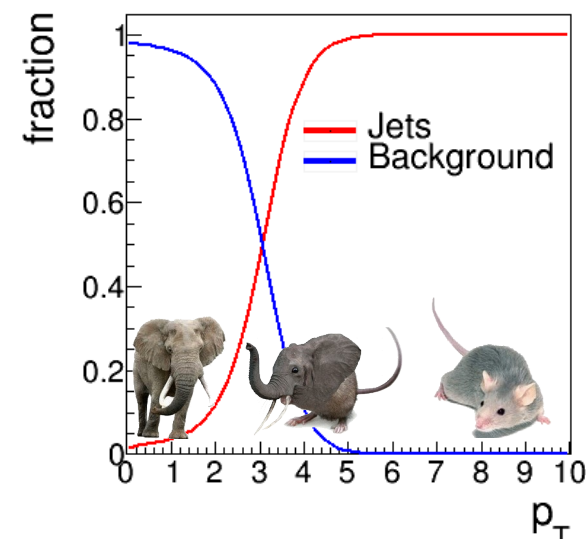
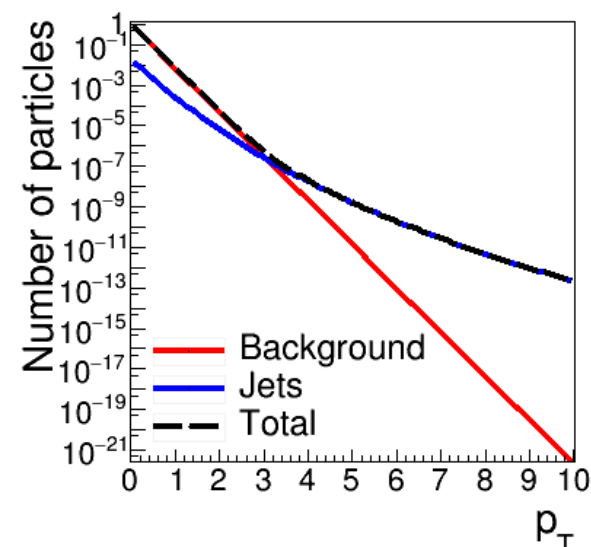


## Background

- Softer
- Correlated with rxn plane
- Large fluctuations/hot spots
- **Combinatorial background**
- **Degraded energy resolution**

# Focus on high $p_T$

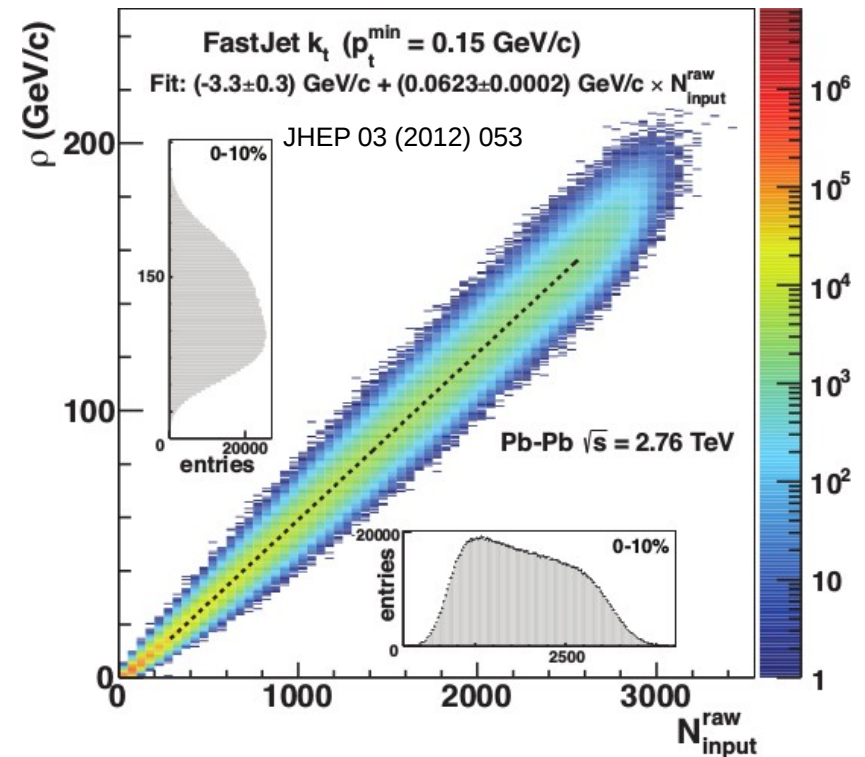
- Pros:
  - Reduces combinatorial background
- Cons:
  - Cuts signal where we expect modifications
  - Could impose a bias



Schematic only!

# Focus on smaller angles

- Pros
  - Background is smaller
  - Background fluctuations smaller
- Cons:
  - Modifications expected at higher R

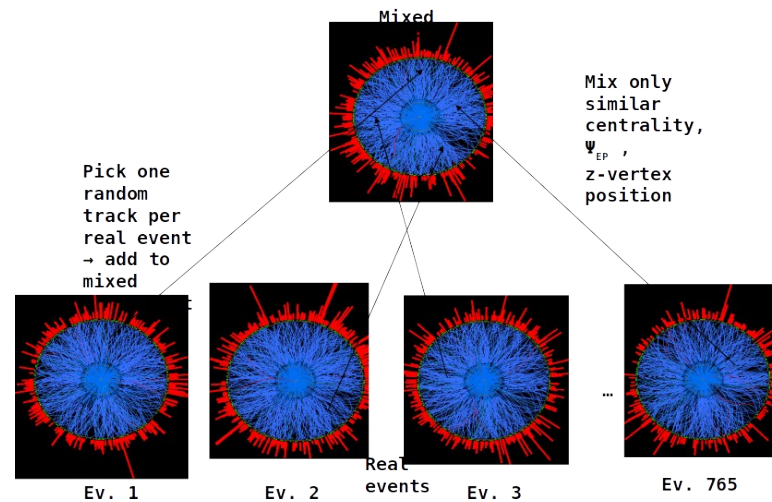




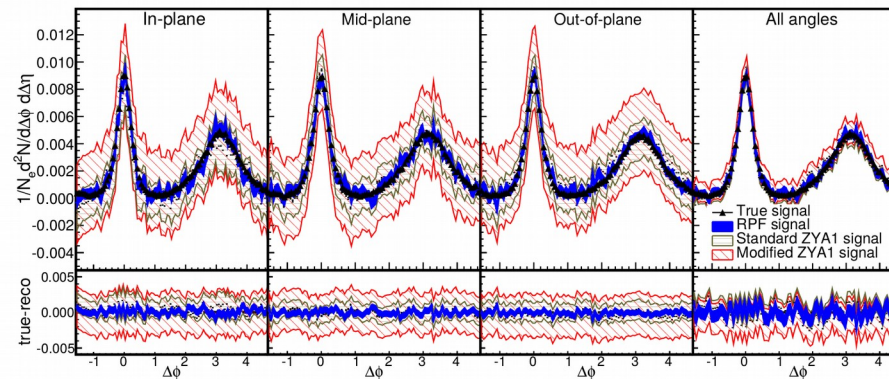
# Carefully quantify background

- Jet reconstruction: mixed events

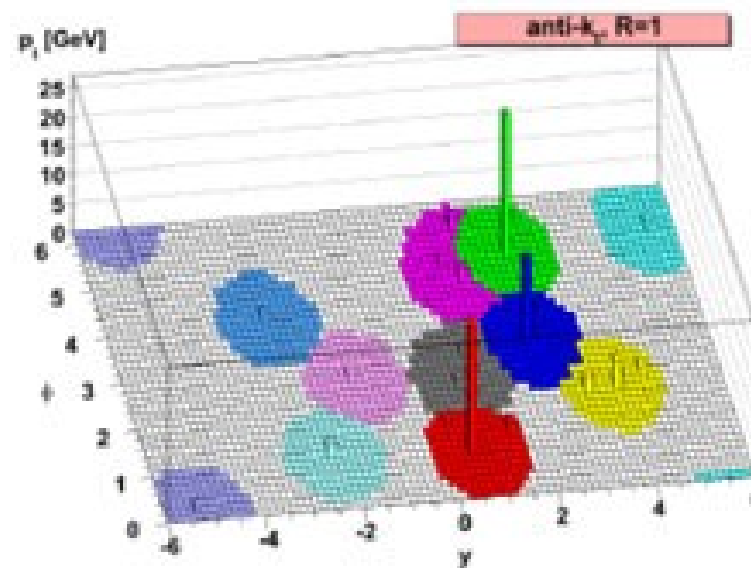
Mixed Event Generation for Jets



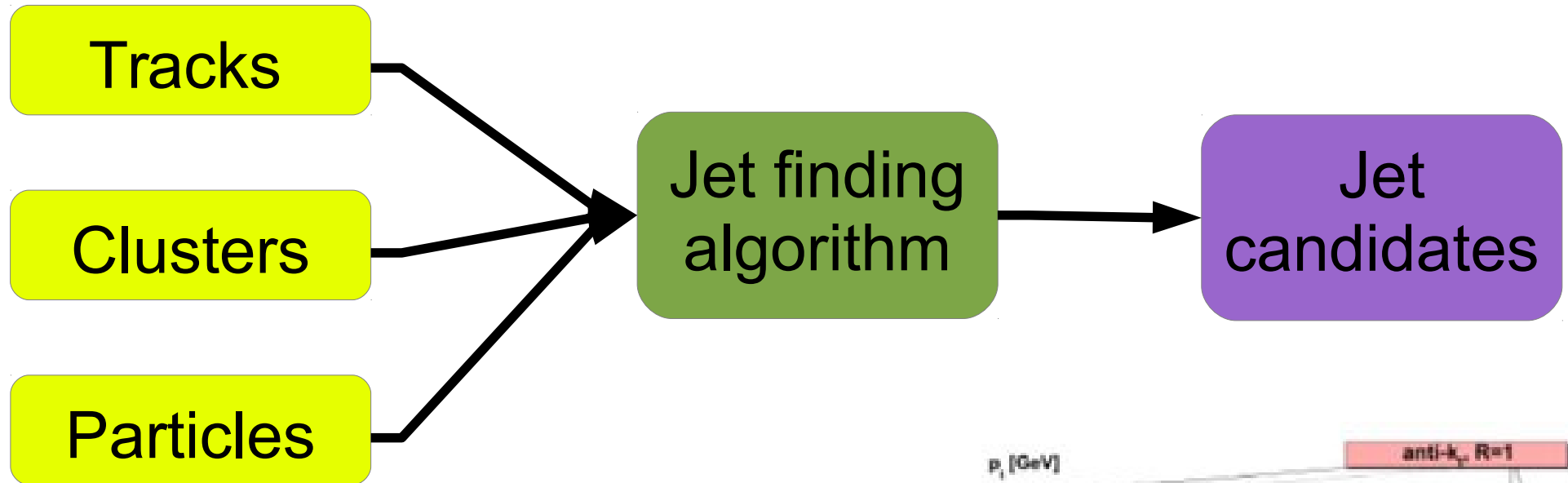
- Correlations: go beyond ZYAM



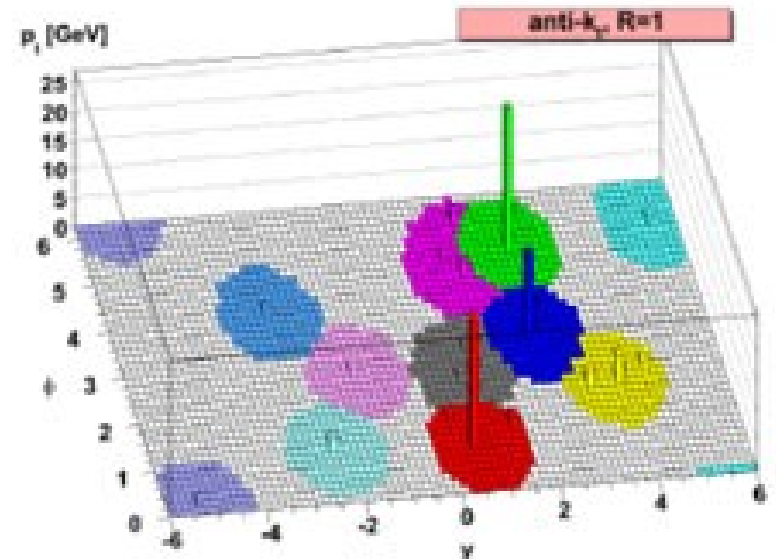
# Reconstructed jets



# Jet finding algorithms



- Any list of objects works as input
- Output only as good as input
- ~~IR Safe~~
- ~~Collinear safe~~



M. Cacciari, G. P. Salam, G. Soyez, JHEP 0804:063,2008

# ALICE/STAR

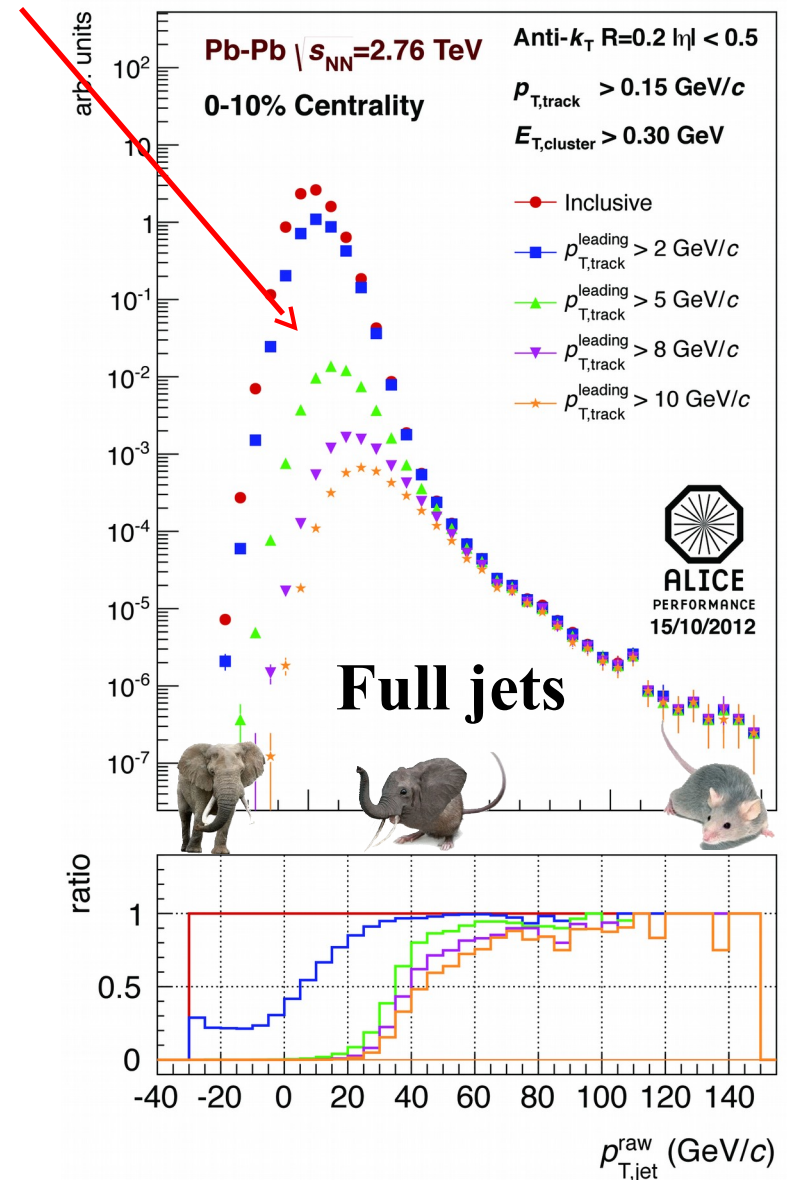
## Combinatorial “jets”

- Estimate combinatorial jet contributions and its fluctuations from data
- Require leading track  $p_T > 5 \text{ GeV}/c$ 
  - Suppresses combinatorial “jets”
  - Biases fragmentation
- No threshold on constituents
- Limited to small R

Measured spectra:

$$p_{T,jet}^{unc} = p_{T,jet}^{rec} - \rho A$$

Where  $p_{T,jet}^{rec}$ ,  $A$   
comes from FastJet anti- $k_T$  algorithm

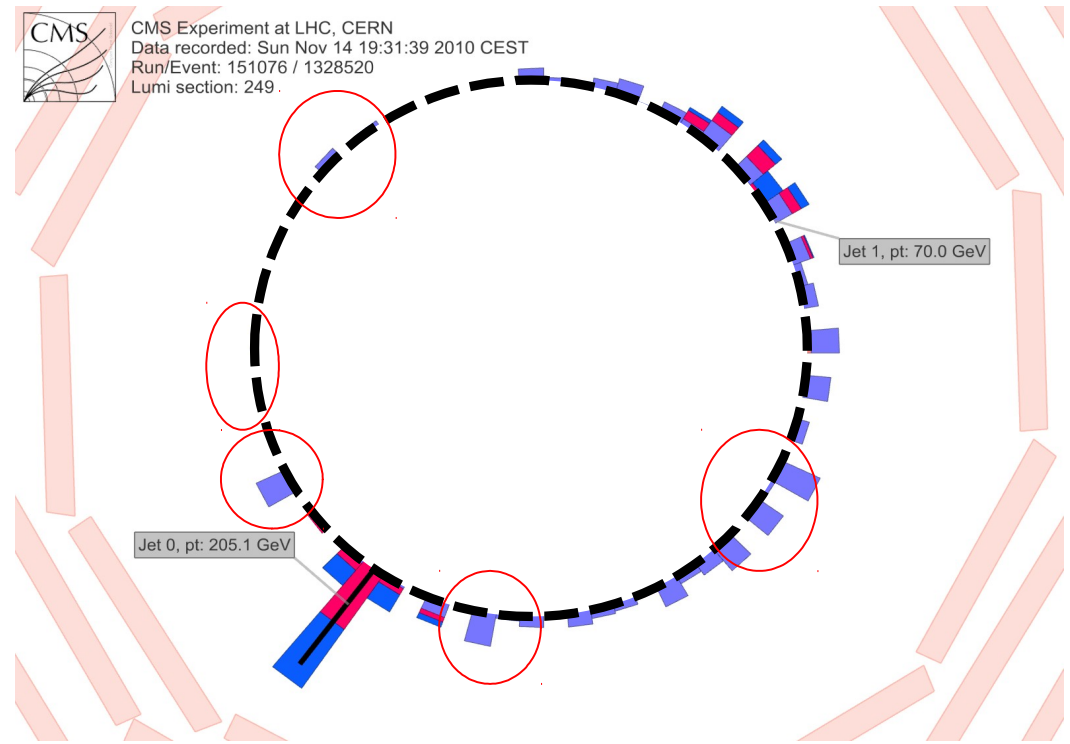


ERF-44496

# CMS: Iterative Pile-Up Event Background Subtraction

Background is estimated

- for each calorimeter ring of constant  $\eta$
- subtracted before jet finding
- re-iterated after excluding the jets found in the first iteration



**Fake Jets:** After the background subtraction, some local fluctuations remain!  
Fluctuations will deteriorate the jet resolution in central events.

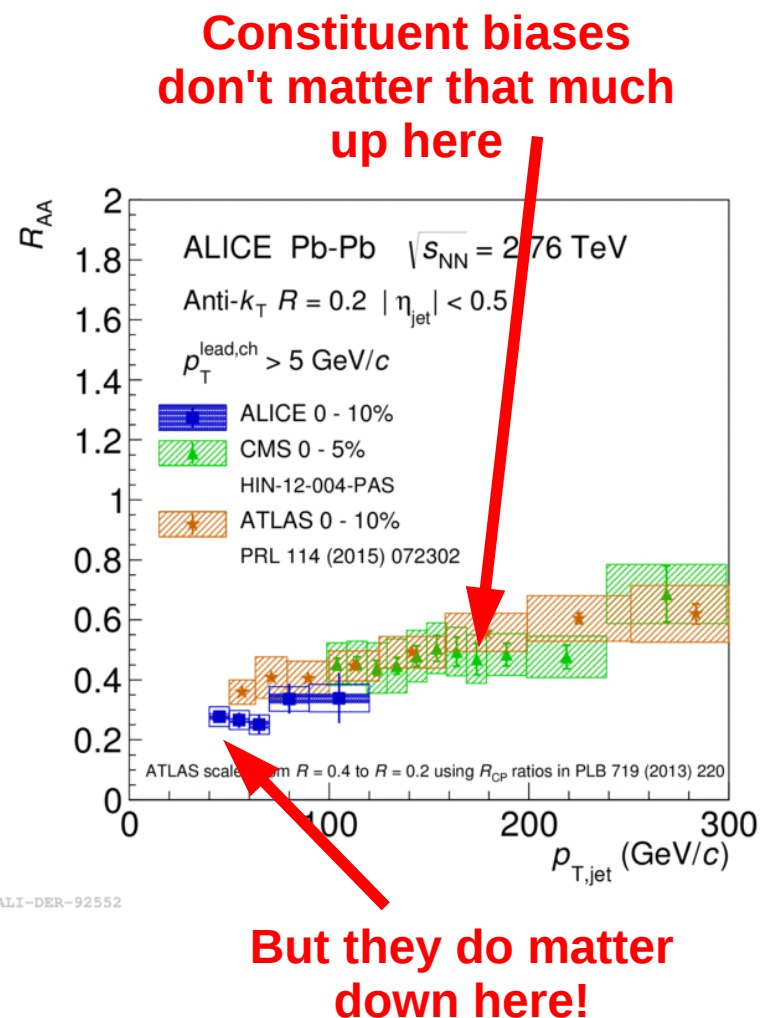
Sevil Salur

13



# ATLAS

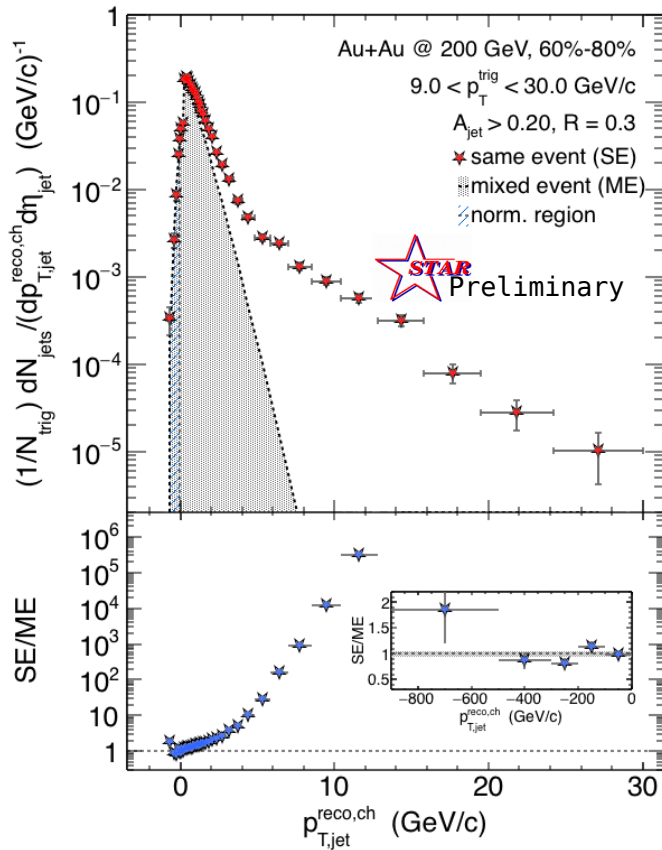
- Iterative procedure
  - **Calorimeter jets:** Reconstruct jets with  $R=0.2$ .  $v_2$  modulated  $\langle \text{Bkgd} \rangle$  estimated by energy in calorimeters excluding jets with at least one tower with  $E_{\text{tower}} > \langle E_{\text{tower}} \rangle$
  - Track jets:** Use tracks with  $p_T > 4$  GeV/c
  - Calorimeter jets from above with  $E > 25$  GeV and track jets with  $p_T > 10$  GeV/c used to estimate background again.
- Calorimeter tracks matching one track with  $p_T > 7$  GeV/c or containing a high energy cluster  $E > 7$  GeV are used for analysis down to  $E_{\text{jet}} = 20$  GeV



**Definitely imposes a bias, especially at 20 GeV!  
We should treat that bias as a tool, not a handicap**

# Event mixing

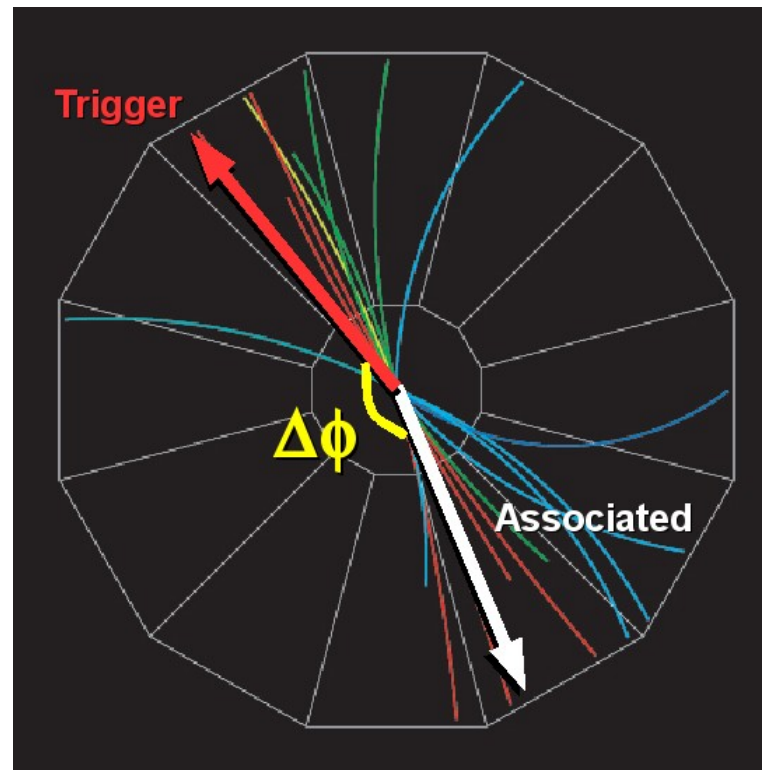
## Peripheral



- Reference spectrum: peripheral collisions
- Much less combinatorial background compared to most central data
- Excellent signal/background ratio down to 3 GeV/c
- Requires normalization at low  $p_T$
- All physical correlations treated like jets

**Alex Schmah, Hard Probes 2015**

# h-h and jet-h correlations



Based largely on:

Sharma, Mazer, Stuart, Nattrass Phys. Rev. C 93, 044915

Nattrass, Sharma, Mazer, Stuart, Bejnood arXiv:1606.00677

# Correlation with reaction plane

- All reaction plane angles

$$B(1 + \sum_{n=2}^{\infty} v_n^t v_n^a \cos(n \Delta \phi))$$

- When trigger is restricted relative to reaction plane
  - Background level modified

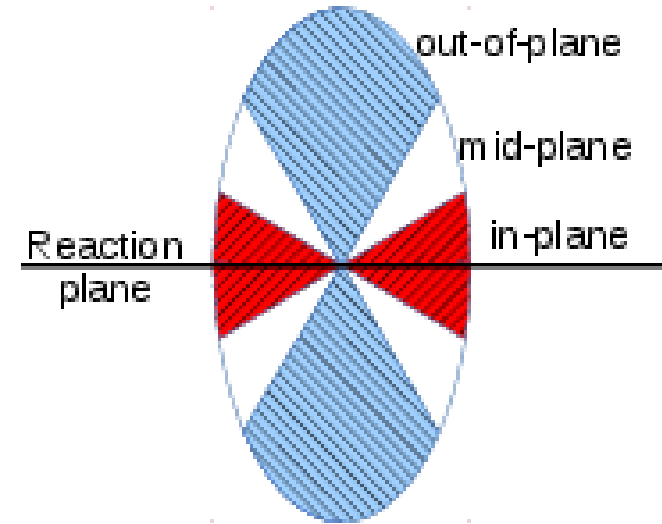
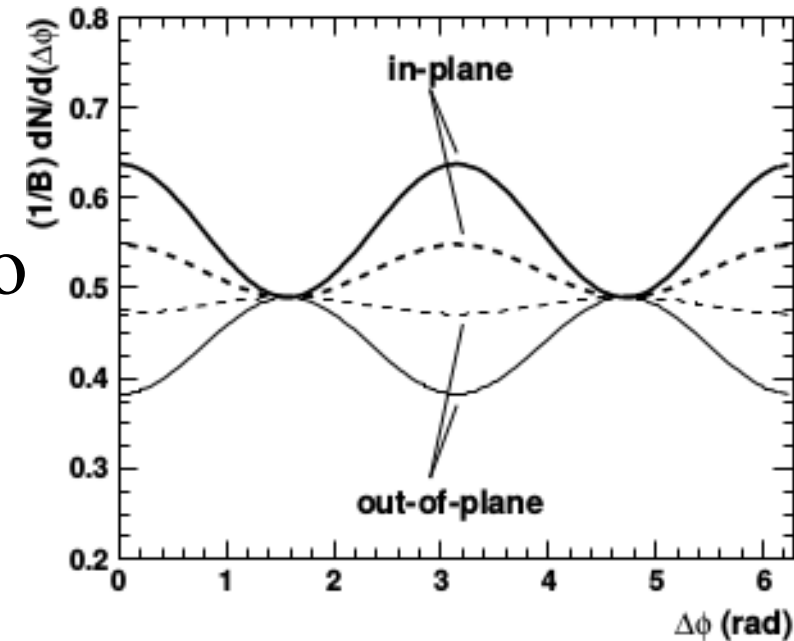
$$B = 1 + \sum_{k=2}^{\infty} 2 v_k^a v_k^{R,t} \cos(k \phi_s) \frac{\sin(kc)}{kc} R_n$$

- Effective  $v_n$  modified

$$v_n^{R,t} = \frac{v_n + \cos(n \phi_s) \frac{\sin(nc)}{nc} R_n + \sum_{k=2,4,6,\dots}^{\infty} (v_{k+n} + v_{k-n}) \cos(k \phi_s) \frac{\sin(kc)}{kc} R_n}{1 + \sum_{k=2,4,6,\dots}^{\infty} 2 v_k \cos(k \phi_s) \frac{\sin(kc)}{kc} R_n}, n = \text{even}$$

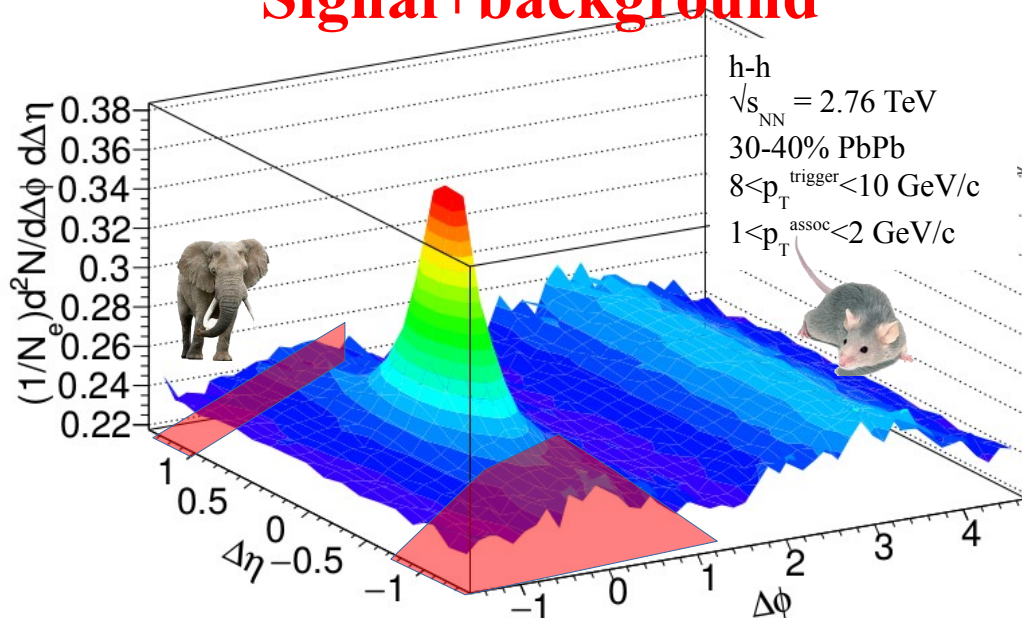
$\phi_s$  is the angular threshold

$$R_n = \langle \cos(n(\psi_{\text{true}} - \psi_{\text{reco}})) \rangle$$



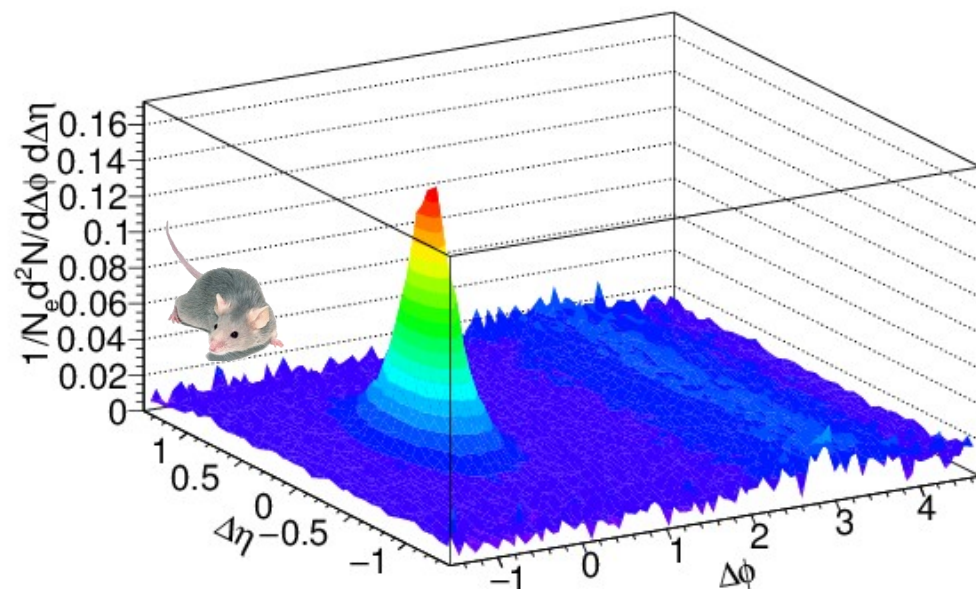
# Separating signal+background

**Signal+background**



**Background dominated region**

**Signal only**



**Using toy model**

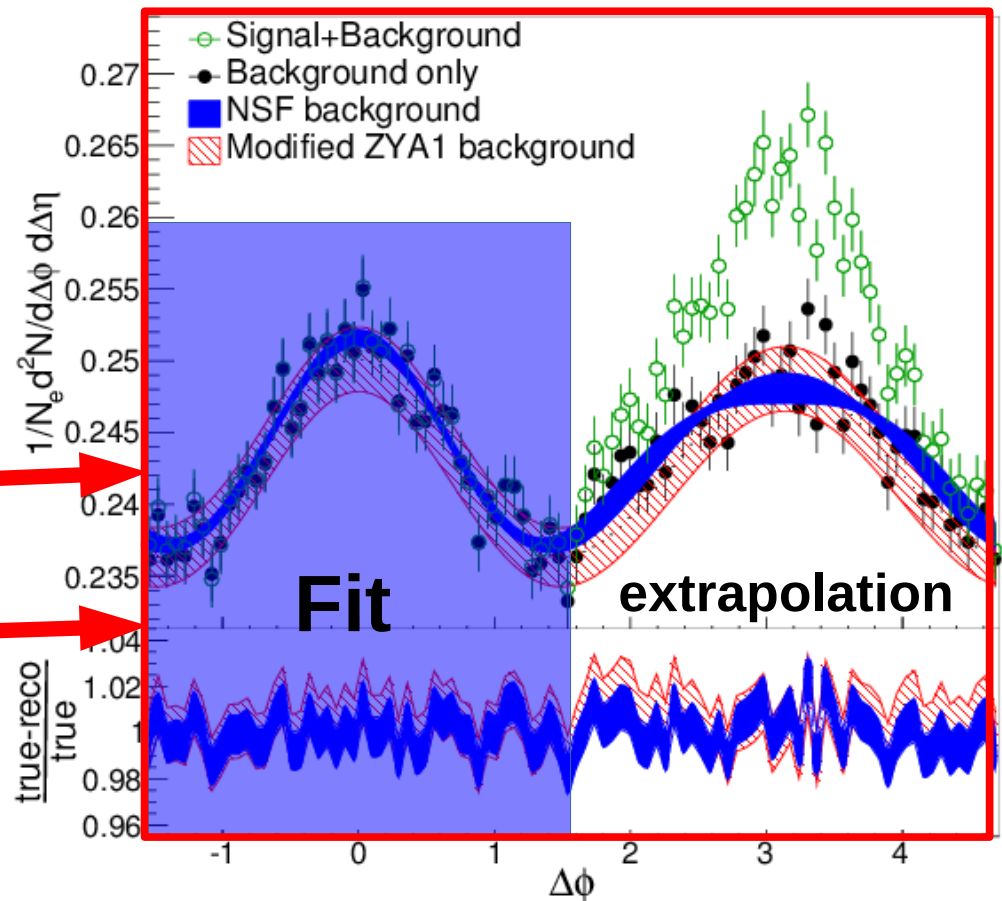
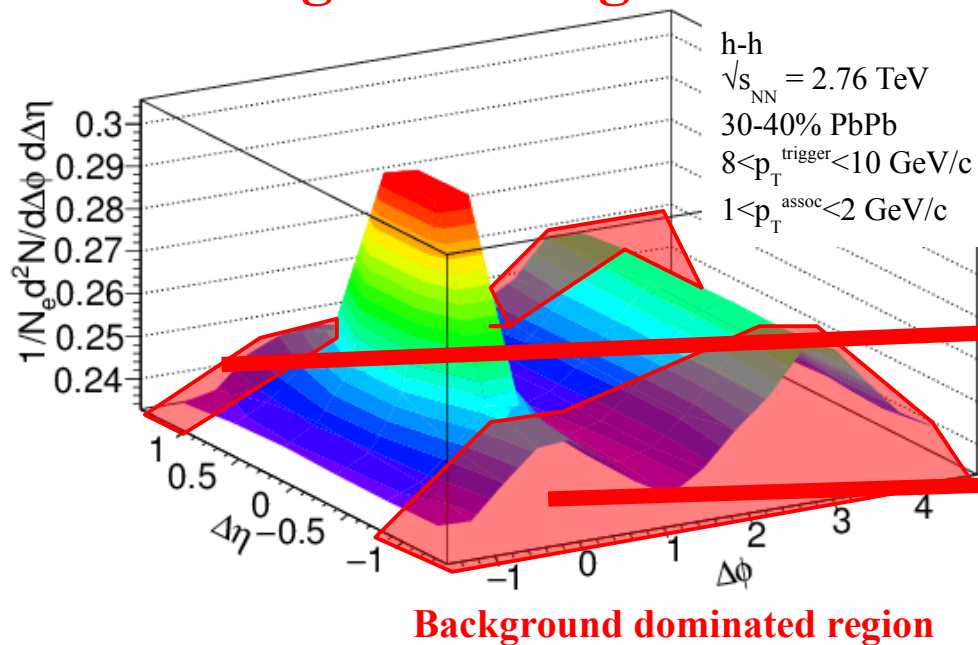
described in Sharma, Mazer, Stuart, Nattrass Phys. Rev. C 93, 044915



# Near-Side Fit (NSF) method

No reaction plane dependence

**Signal+background**



- Project signal+background over  $1.0 < |\Delta\eta| < 1.4$
- Fit background in  $|\Delta\phi| < \pi/2$  with  $v_n$  up to  $n=4$

# Near-Side Fit (NSF) method

No reaction plane dependence

- Reconstructs signal with less bias and smaller errors than ZYA1 method
- Extract  $v_n$  consistent with input

Sample		Yield ( $Y \times 10^{-3}$ )	
		near-side	away-side
30-40% h-h	True	$17.1 \pm 0.1 \pm 0.2$	$19.9 \pm 0.1 \pm 0.2$
	Mod. ZYA1	$18.9 \pm 4.2 \pm 1.2$	$21.9 \pm 4.2 \pm 1.2$
	Std. ZYA1	$15.7 \pm 1.6 \pm 1.2$	$18.7 \pm 1.6 \pm 1.2$
	NSF	$17.14 \pm 1.1$	$20.14 \pm 1.11$

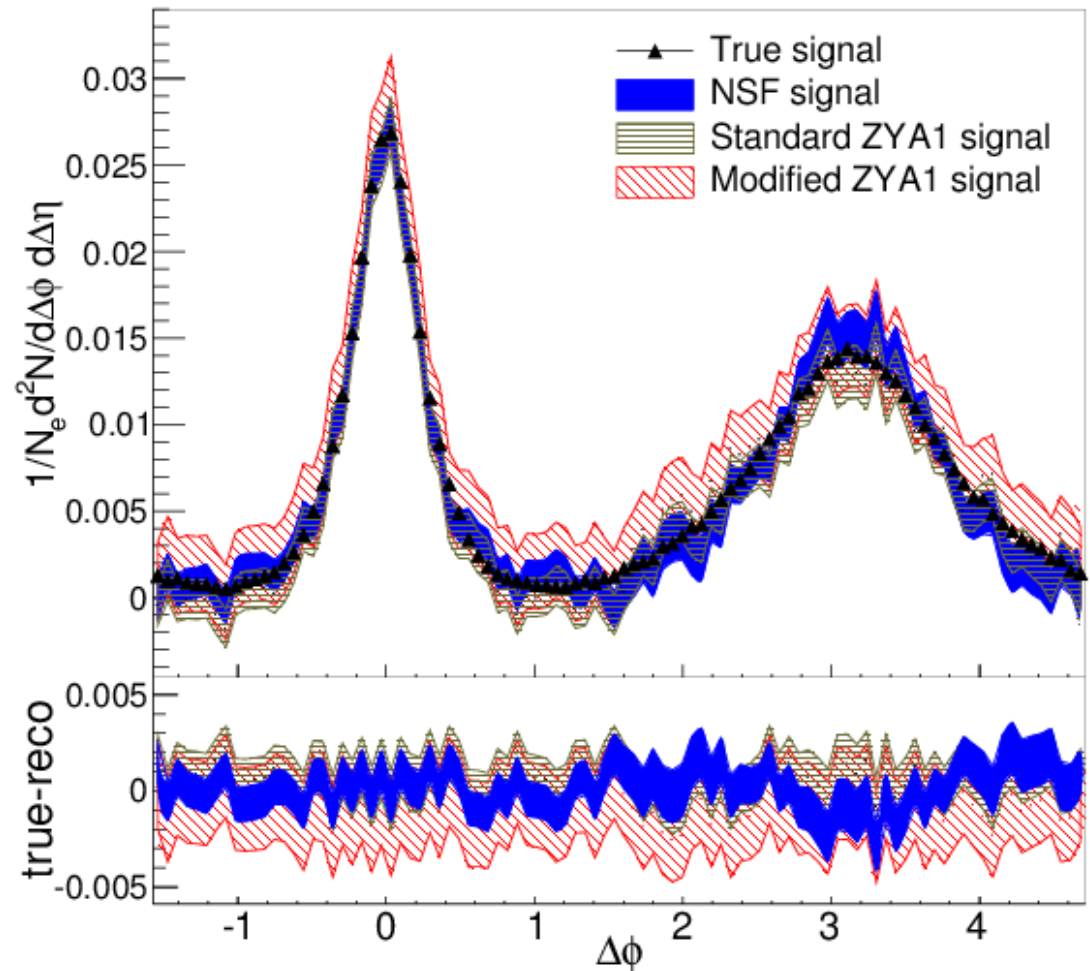
h-h

$\sqrt{s_{NN}} = 2.76$  TeV

30-40% PbPb

$8 < p_T^{\text{trigger}} < 10$  GeV/c

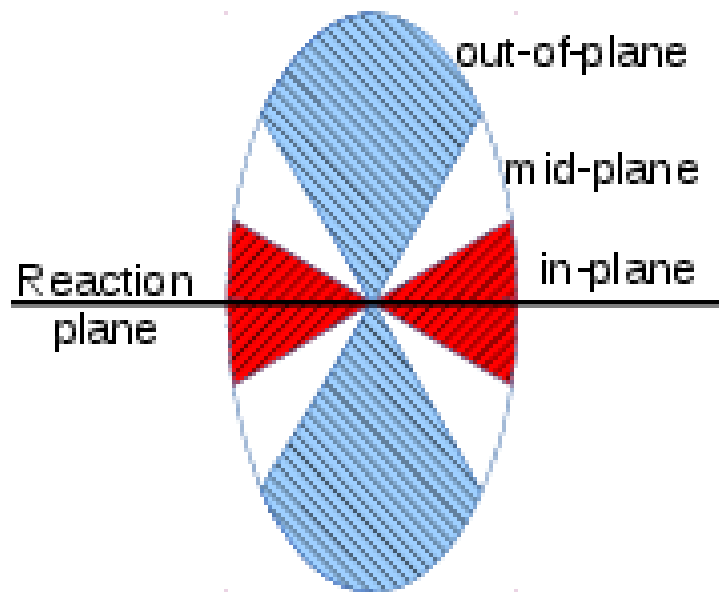
$1 < p_T^{\text{assoc}} < 2$  GeV/c



Standard ZYA1 = Zero Yield at  $\Delta\Phi=1$

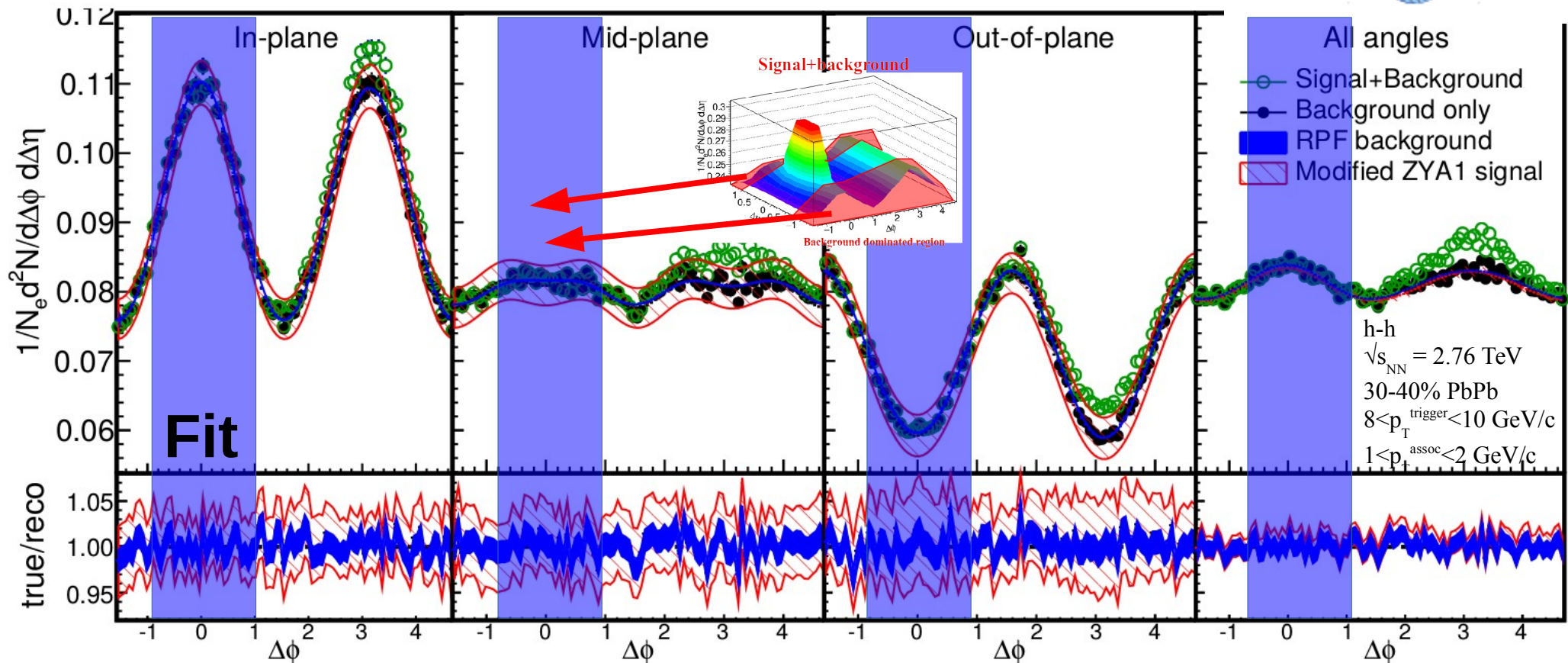
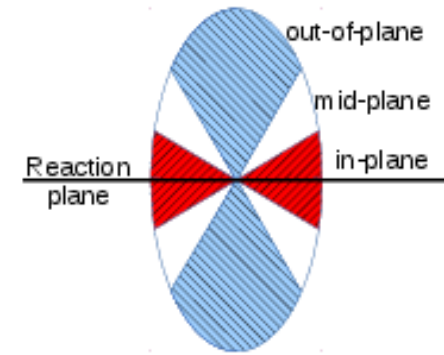
Modified ZYA1 = Zero Yield at  $\Delta\Phi=1$  for  $1.0 < |\Delta\eta| < 1.4$

# Adding reaction plane dependence



# Reaction Plane Fit (RPF) method

30-40% central

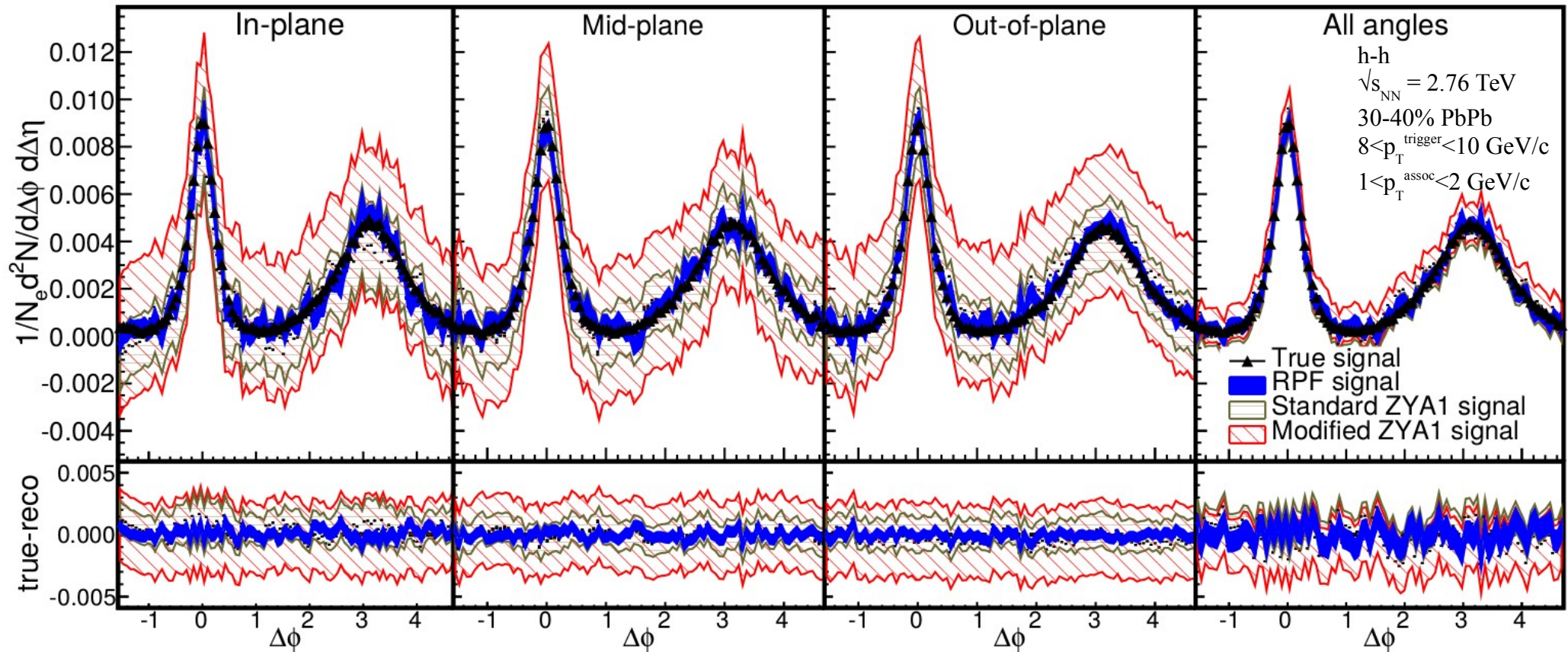
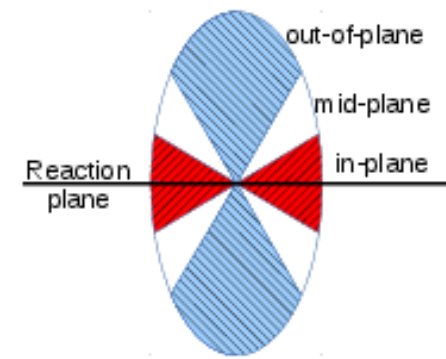


- Project signal+background over  $1.0 < |\Delta\eta| < 1.4$
- Fit background in  $|\Delta\phi| < 1$  including reaction plane dependence
- $v_n$  and B extracted with  $v_n$  up to  $n=4$



# Reaction Plane Fit (RPF) method

30-40% central

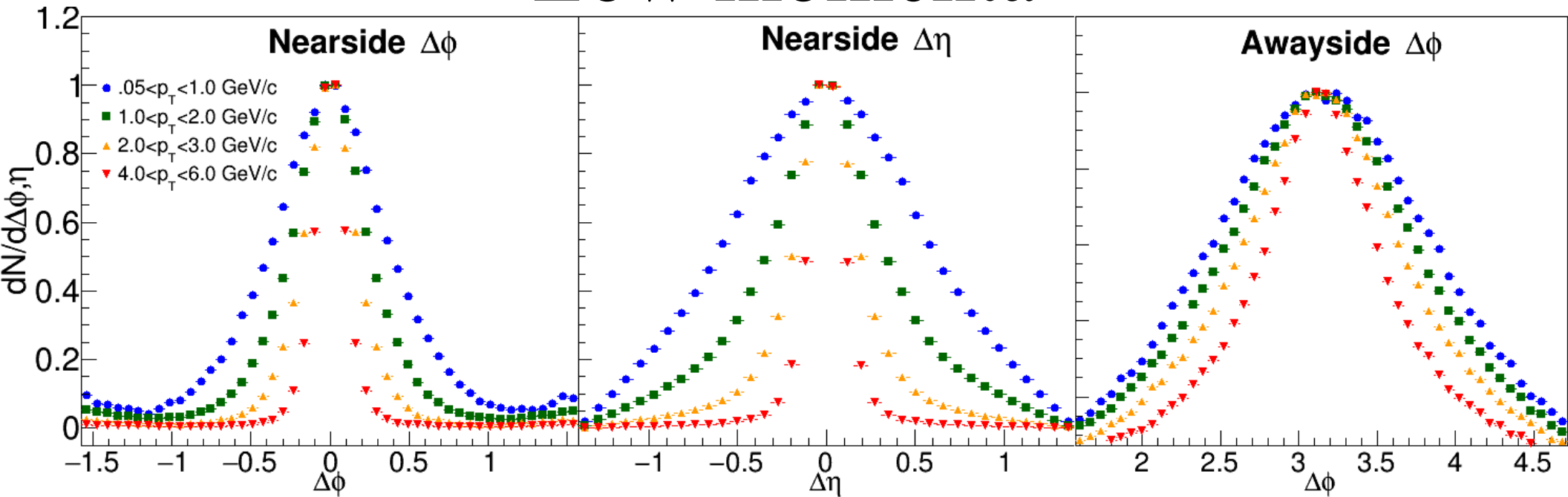


	near-side $Y \times 10^{-3}$				away-side $Y \times 10^{-3}$			
	in-plane	mid-plane	out-of-plane	All	in-plane	mid-plane	out-of-plane	All
True								
Mod. ZYA1	$5.78 \pm 0.03 \pm 0.13$	$5.77 \pm 0.03 \pm 0.14$	$5.65 \pm 0.03 \pm 0.13$	$17.1 \pm 0.1 \pm 0.2$	$6.74 \pm 0.03 \pm 0.13$	$6.72 \pm 0.03 \pm 0.14$	$6.52 \pm 0.03 \pm 0.13$	$19.9 \pm 0.1 \pm 0.2$
Std. ZYA1	$6.3 \pm 5.9 \pm 1.7$	$5.7 \pm 6.0 \pm 0.3$	$6.8 \pm 6.1 \pm 0.9$	$18.9 \pm 4.2 \pm 1.2$	$7.3 \pm 5.9 \pm 1.7$	$6.8 \pm 6.0 \pm 0.3$	$7.7 \pm 6.1 \pm 0.9$	$21.9 \pm 4.2 \pm 1.2$
RPF ( $ \Delta\phi  < \pi/2$ )	$4.5 \pm 2.3 \pm 1.7$	$5.5 \pm 2.3 \pm 0.3$	$5.6 \pm 2.3 \pm 0.9$	$15.7 \pm 1.6 \pm 1.2$	$5.5 \pm 2.3 \pm 1.7$	$6.5 \pm 2.3 \pm 0.3$	$6.5 \pm 2.3 \pm 0.9$	$18.7 \pm 1.6 \pm 1.2$
RPF ( $ \Delta\phi  < 1$ )	$5.5 \pm 0.4$	$5.7 \pm 0.3$	$5.9 \pm 0.3$	$17.0 \pm 0.7$	$6.6 \pm 0.4$	$6.8 \pm 0.3$	$6.8 \pm 0.3$	$20.1 \pm 0.7$
	$5.7 \pm 0.4$	$5.8 \pm 0.4$	$5.9 \pm 0.3$	$17.4 \pm 0.7$	$6.8 \pm 0.4$	$6.8 \pm 0.4$	$6.8 \pm 0.3$	$20.4 \pm 0.7$

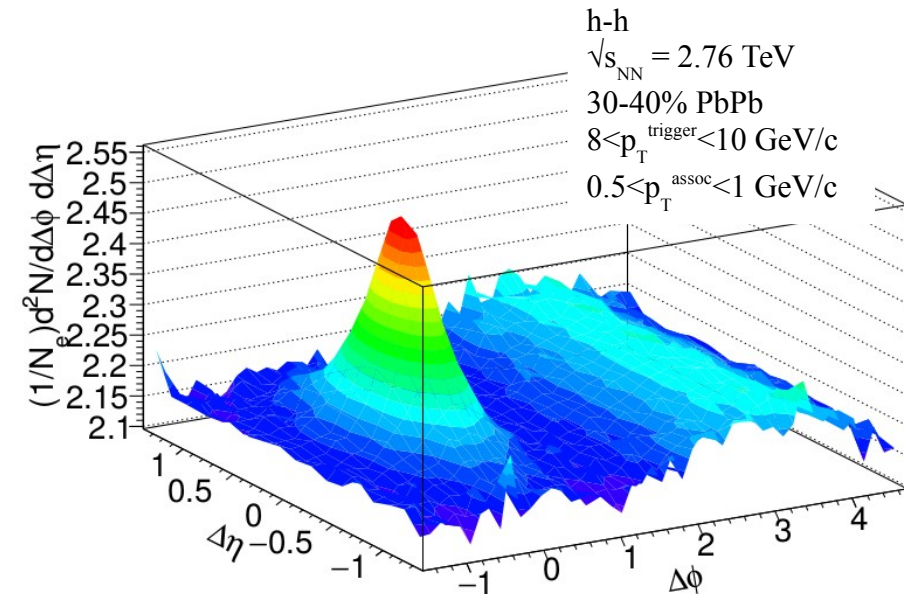


# Going to lower momenta

# Low momenta

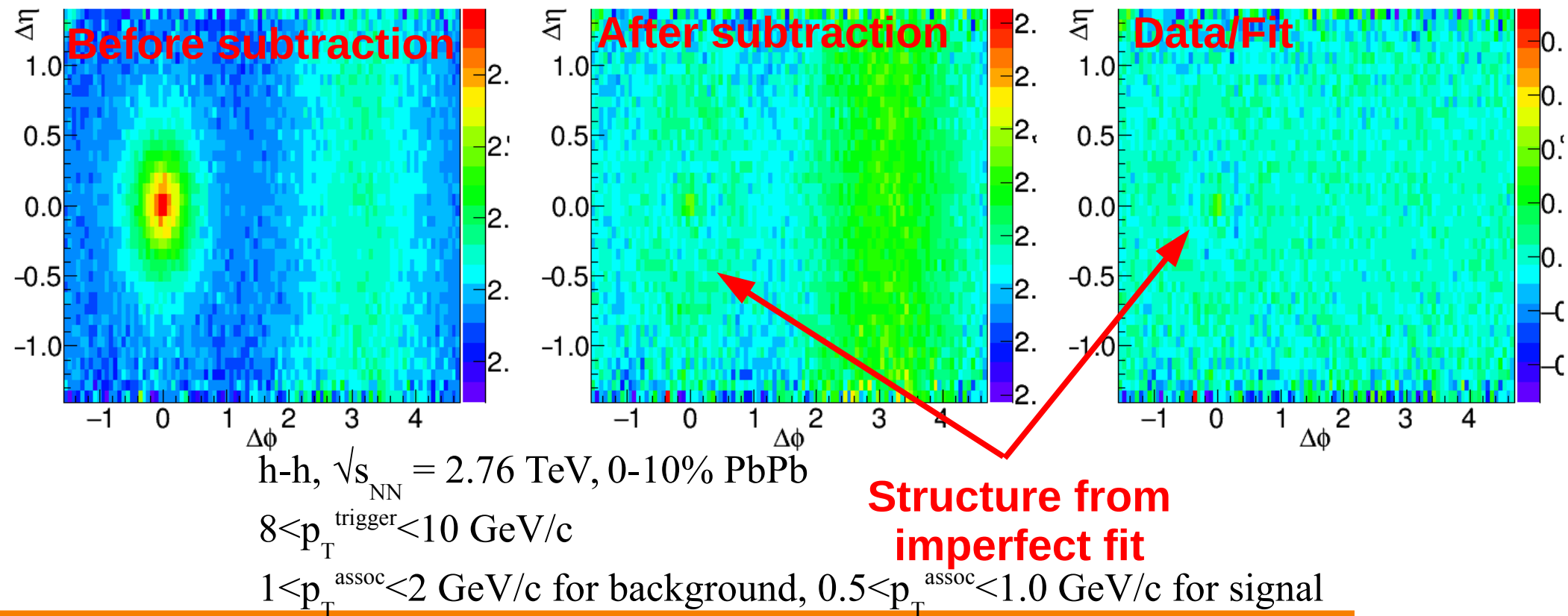


- ZYAM assumptions break down at low  $p_T$
- If method doesn't work on PYTHIA, it can't be trusted on data!
- But low  $p_T$  is interesting!



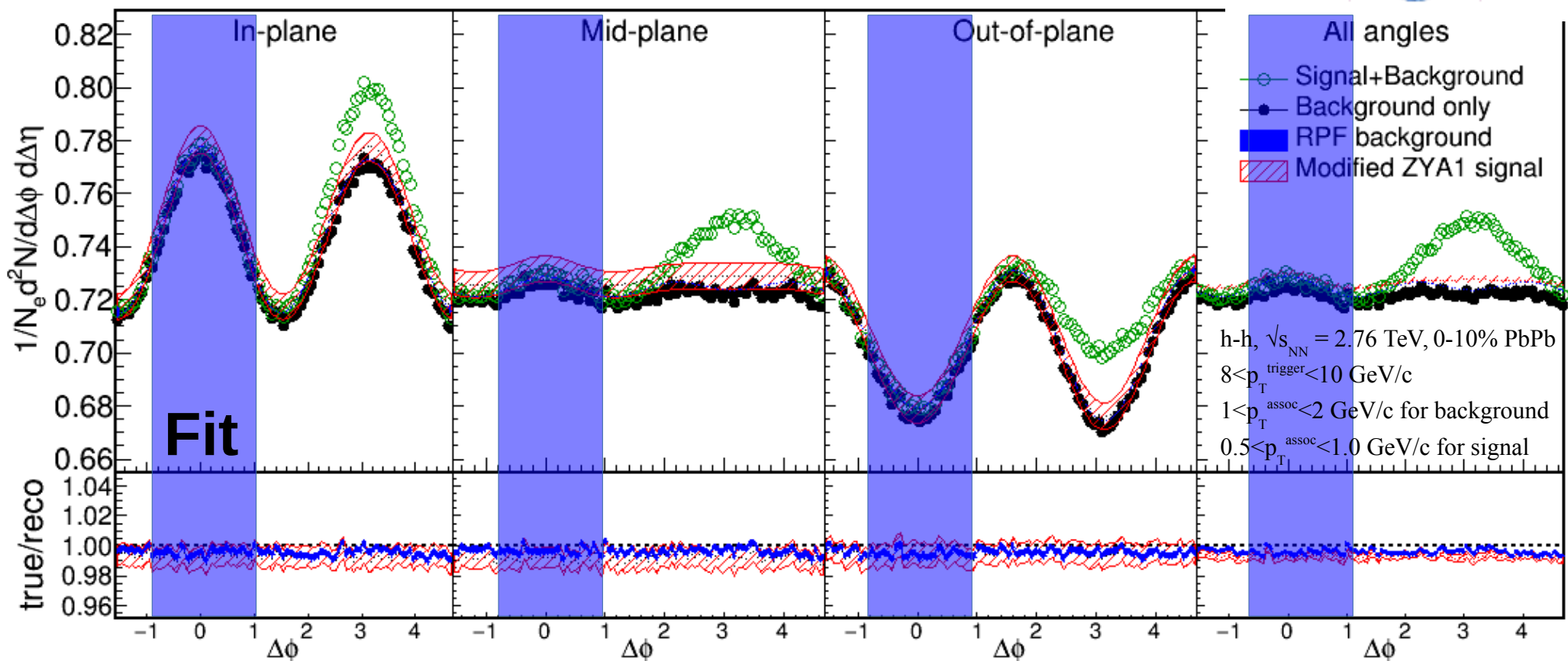
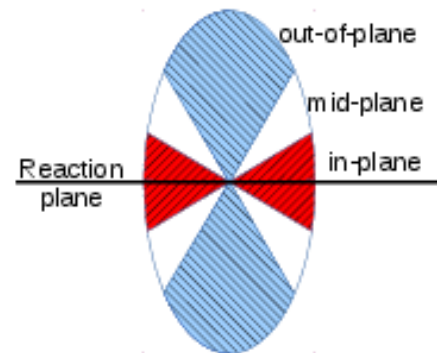
# Going to lower momenta, medium modifications

- Peak gets broader
- Fit near-side peak and subtract it
- Increase  $\Delta\eta$  range available for background subtraction



# Near-Side Subtracted RPF method

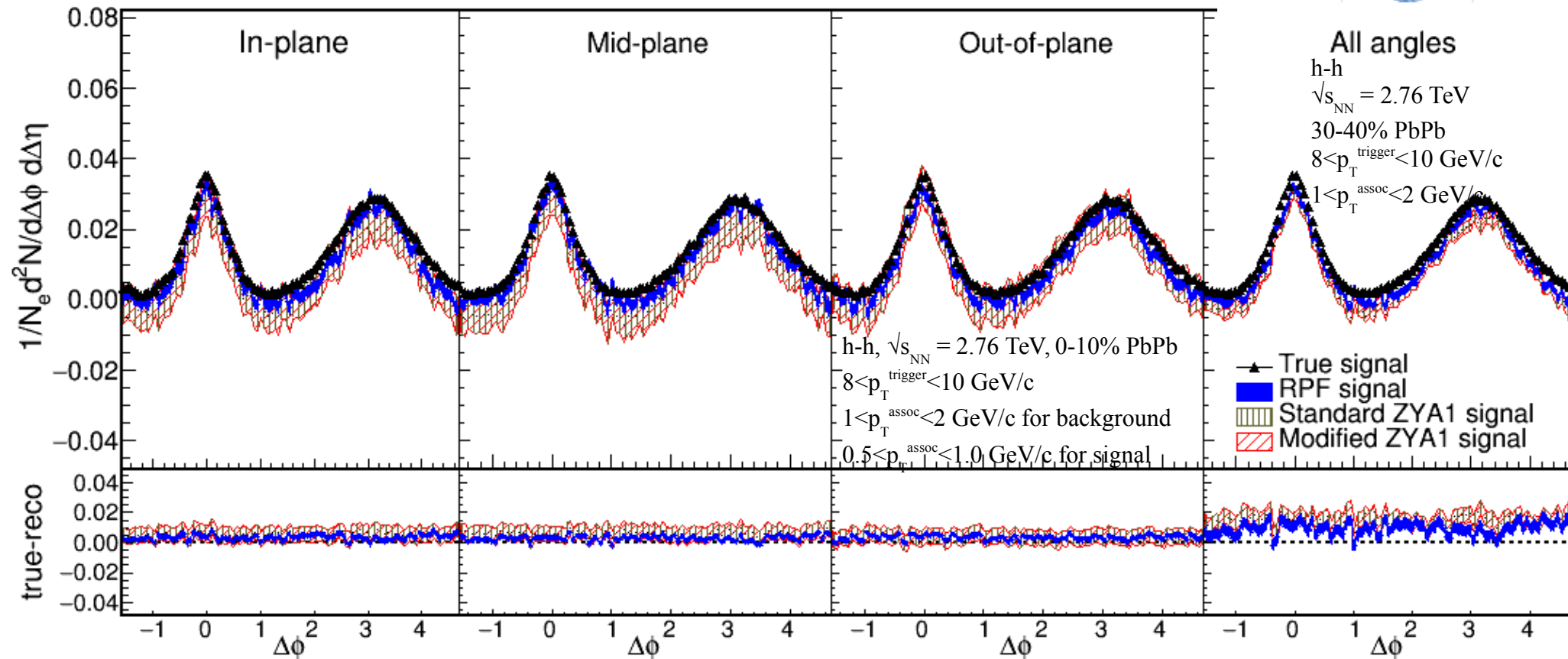
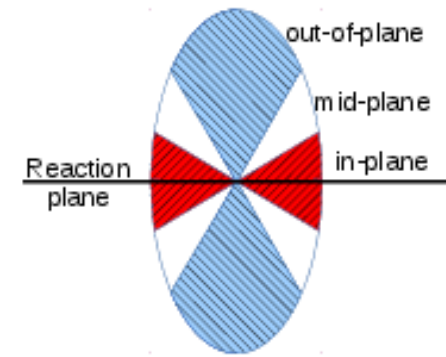
30-40% central



- Project signal+background over  $0.0 < |\Delta\eta| < 1.4$
- Fit background in  $|\Delta\phi| < 1$  including reaction plane dependence
- $v_n$  and B extracted with  $v_n$  up to  $n=4$

# Reaction Plane Fit (RPF) method

30-40% central



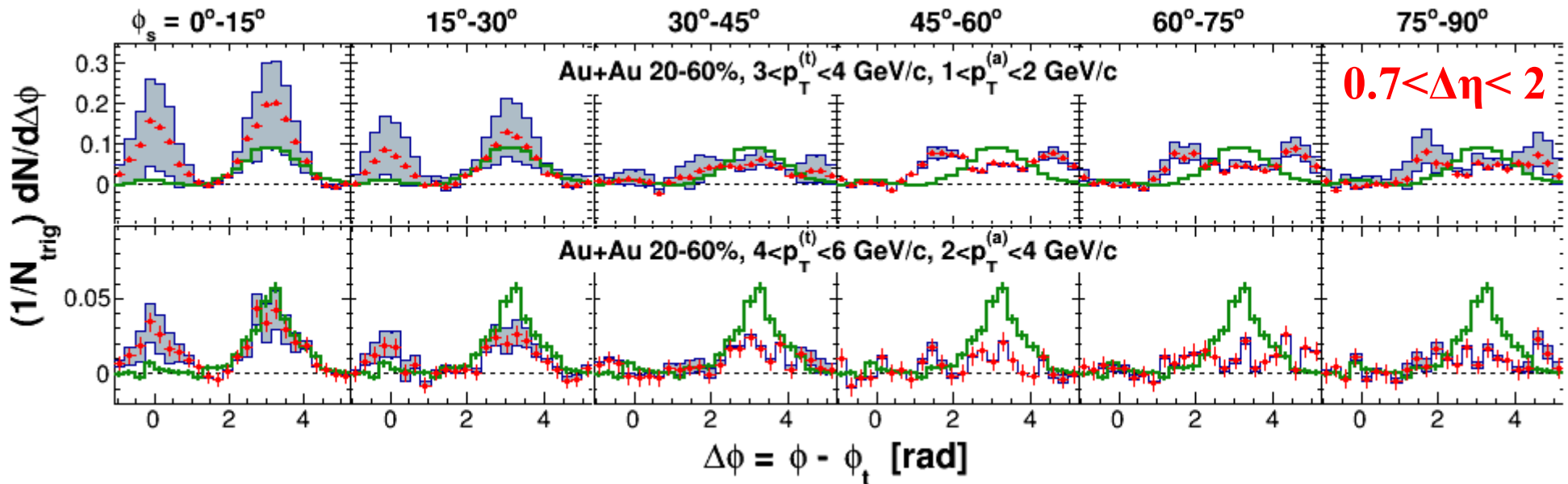
- **Works beautifully!**



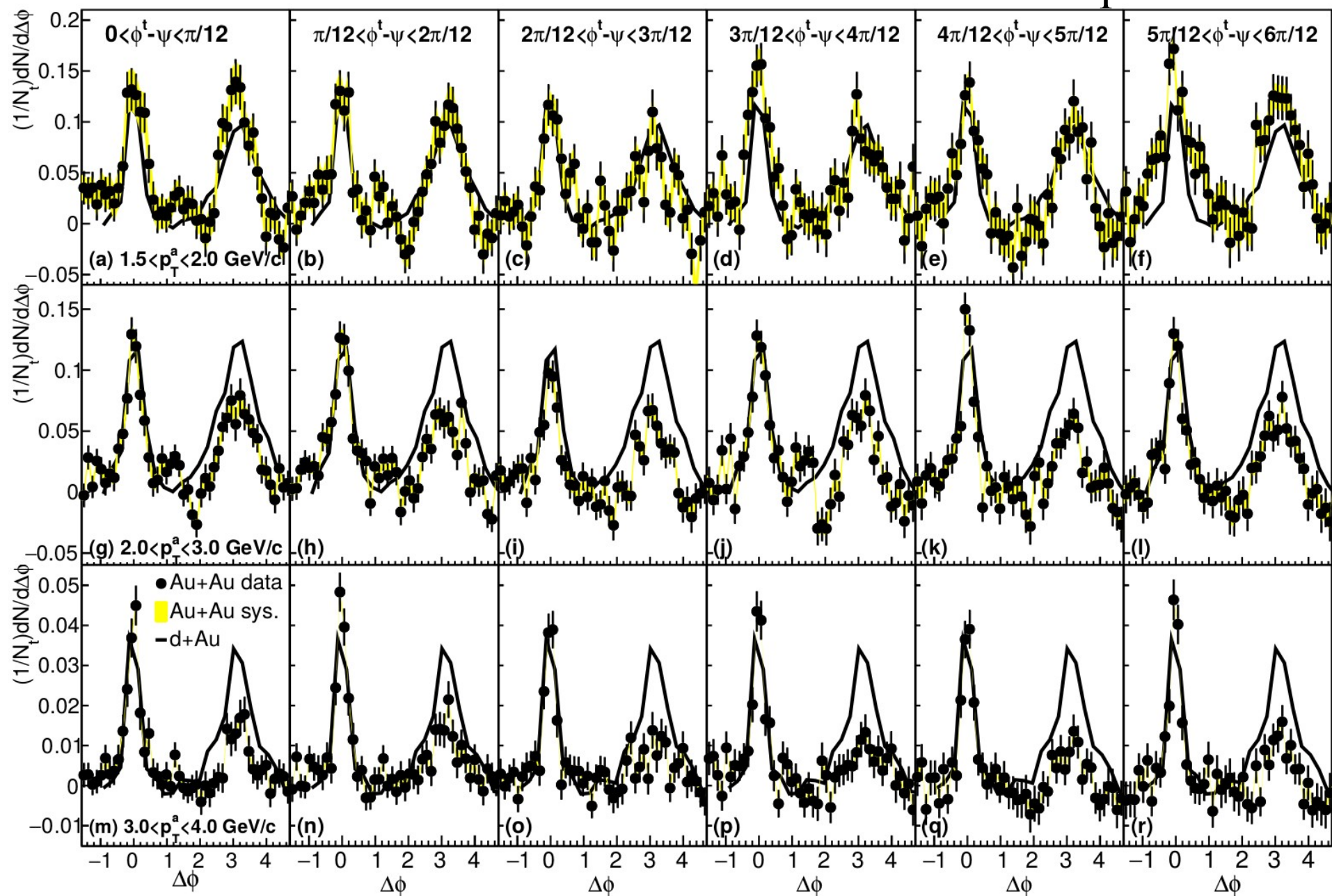
# Revisiting dihadron correlations

# STAR measurements of dihadron correlations relative to reaction plane

- Correlations on arxiv (nucl-ex/1010.0690 v2)
  - Published article (Phys. Rev. C 89 (2014) 41901) does not include raw correlations
- ZYAM background subtraction
  - Reports ridge at  $\Delta\eta > 0.7$
  - RPF method assumes no signal at  $\Delta\eta > 0.7$



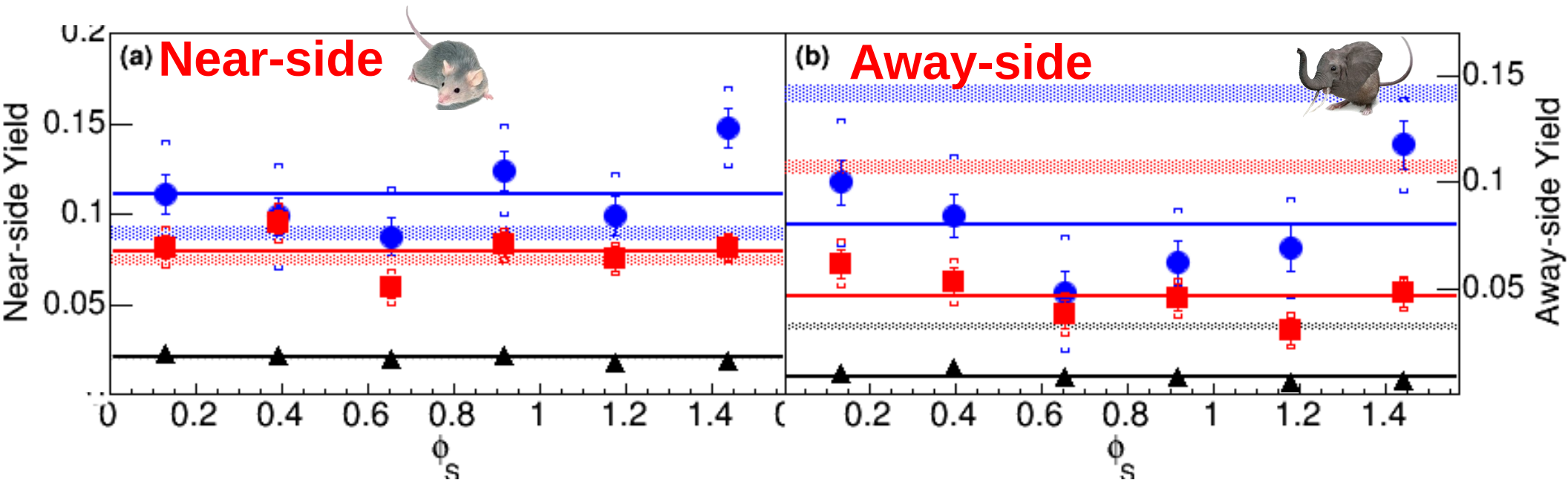
# Background subtracted correlations $4 < p_T^t \leq 6 \text{ GeV}/c$



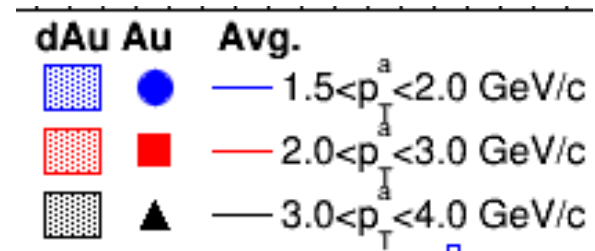
**No “Mach Cone”, up to 10x higher precision**

Statistical error bars include correlated statistical error on background

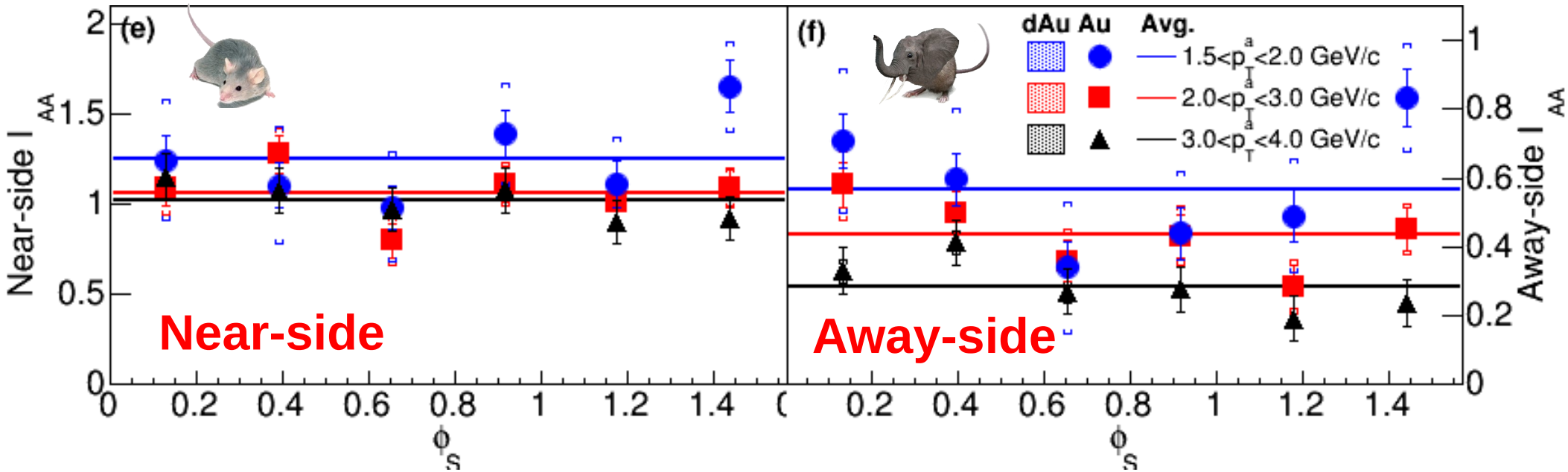
# Yields $4 < p_T^t < 6 \text{ GeV}/c$



- NS: No dependence on  $\phi_S = \phi^t - \psi$
- AS: can see  $\phi_S$  dependence
- Higher precision than previous analyses

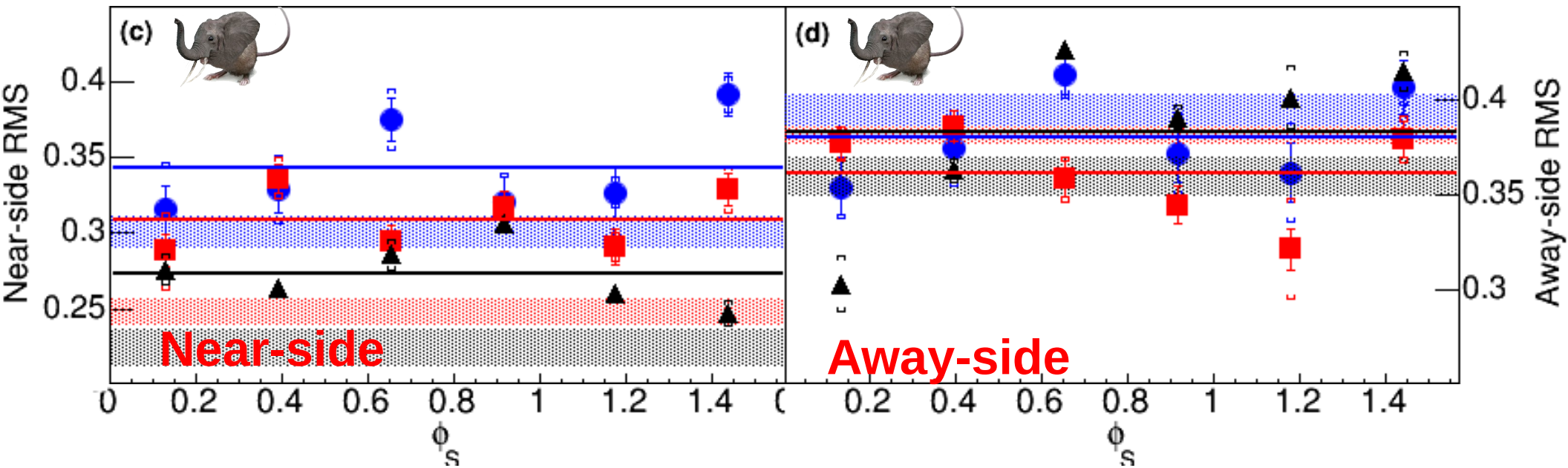


$$I_{AA} = Y_{AuAu} / Y_{dAu}$$



- NS: No dependence on  $\phi_S = \phi^t - \psi$
- AS: can see  $\phi_S$  dependence
- Higher precision than previous analyses

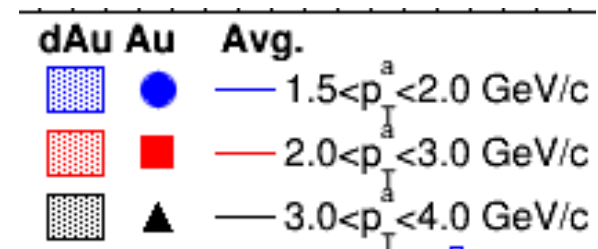
# Truncated RMS $4 < p_T^t < 6 \text{ GeV}/c$



$$RMS_{trunc}^{NS} = \sqrt{\int_{-0.8}^{0.8} \Delta \phi^2 C(\Delta \phi) d \Delta \phi}$$

$$RMS_{trunc}^{AS} = \sqrt{\int_{\pi-0.8}^{\pi+0.8} (\Delta \phi - \pi)^2 C(\Delta \phi) d \Delta \phi}$$

- Lines show averages
- Higher precision than public analysis (different  $p_T$ )

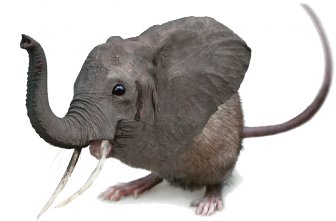




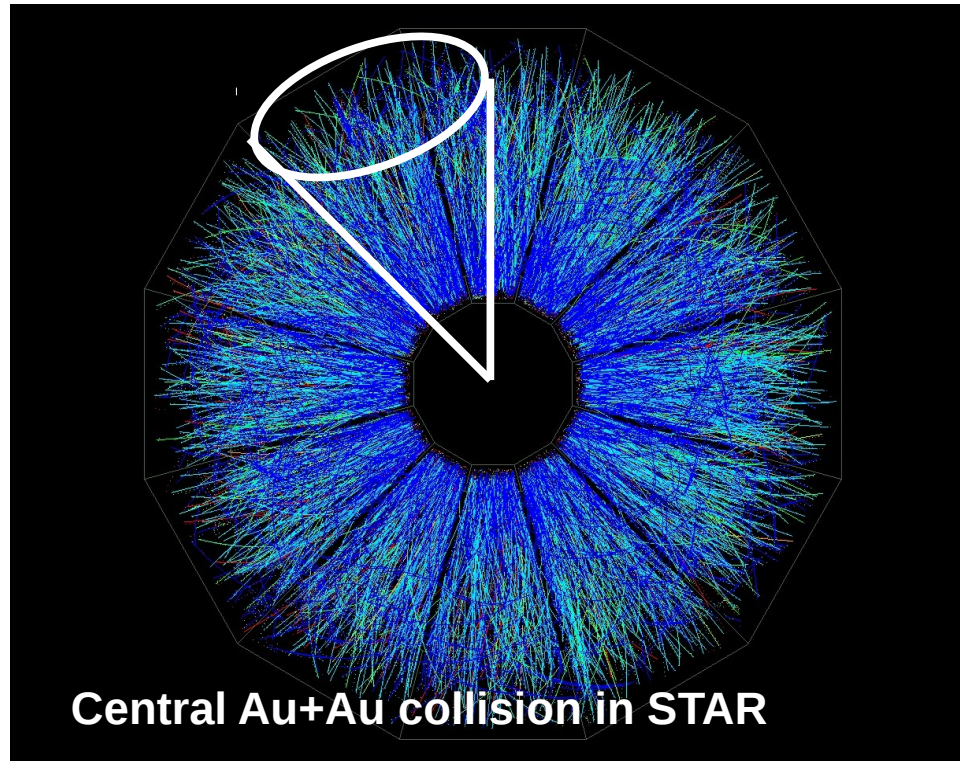
# Conclusions

# Conclusions

- With right background subtraction, we can see low  $p_T$  modifications!
- Dihadron correlations:
  - now consistent with fully reconstructed jets
  - Broadening and softening of jet
- Need to continue to work to understand background better!
- Need to treat bias as a tool



# Background for jet studies



- New method for subtracting combinatorial background from flow (nucl-ex/1509.04732 accepted to PRC)
- Improvements on new method
- Reanalysis of published STAR data (nucl-ex/1010.0690)

# Conclusions

- NSF, RPF, NSS(NSF/RPF) methods work!
  - Much higher precision than ZYAM
  - NSS works to extend analyses to low  $p_T$
- Qualitatively different results from public STAR analysis
  - Little/no reaction plane dependence in yield, RMS at these momenta
  - Away-side does not disappear completely, comparable to d+Au
  - More subtle effects than with ZYAM

# Background Subtraction Methods

- **Zero-Yield at Minimum (ZYAM):** Assumes  $v_n$  from other studies, assumes region around  $\Delta\phi \approx 1$  is background dominated
- **Near-Side Fit (NSF):** assumes small  $\Delta\phi$ /large  $\Delta\eta$  region background dominated, fits  $v_n$  and B
- **Reaction Plane Fit (RPF):** assumes small  $\Delta\phi$ /large  $\Delta\eta$  region background dominated, fits  $v_n$  and B **using reaction plane dependence**
- **Near-Side Subtracted NSF/RPF (NSS NSF/RPF):** fits  $v_n$  and B at small small  $\Delta\phi$  using reaction plane dependence **after subtracting the near-side with a fit**



# RPF Method as applied to STAR data

- 6 bins relative to reaction plane
- Background level
  - Normalized per trigger  $\rightarrow$  B same in all bins if  $v_2^t$  is the only effect  $\rightarrow$  reduces info for RPF
  - “The background levels can be different for the different  $\phi_s$  slices **because of the net effect of the variations in jet-quenching with  $\phi_s$**  and the centrality cuts in total charged particle multiplicity in the TPC within  $|\eta| < 0.5$ .” (Pg. 10, arxiv version)  $\rightarrow$  **Not consistent with ZYAM assumptions!**
- Used reaction plane resolution values from paper and their uncertainties
  - Used TPC for reaction plane and analysis – potential autocorrelations
- Data available for  $\Delta\eta < 0.7$  (signal+background) and  $0.7 < \Delta\eta < 2$  (background dominated)
  - Acceptance correction in not applied  $\rightarrow$  background must be scaled  $\rightarrow$  uncertainty
  - Jet-like correlation not eliminated in  $0.7 < \Delta\eta < 2$  for all  $p_T^t, p_T^a$  given in paper  $\rightarrow$  **focus on high  $p_T$**

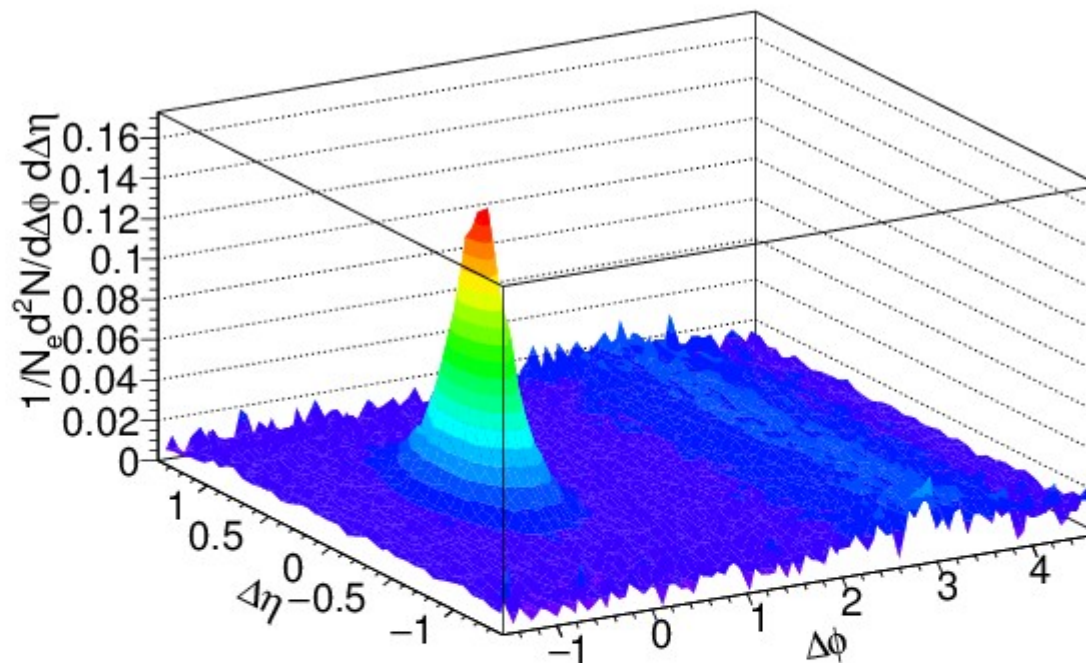
# Toy model

# Model for background

- True reaction plane angle is always at  $\phi=0$  in detector coordinates
- Throw random reconstructed reaction plane angle
  - Assume Gaussian reaction plane resolution
  - Selected to approximate data
- Use measured particle yields to calculate how many associated particles would be measured
- Use measured  $v_n$  to determine their anisotropy relative to the reaction plane
- Throw associated particles matching distribution observed in data using  $v_n$  up to  $n=10$

# Model for signal

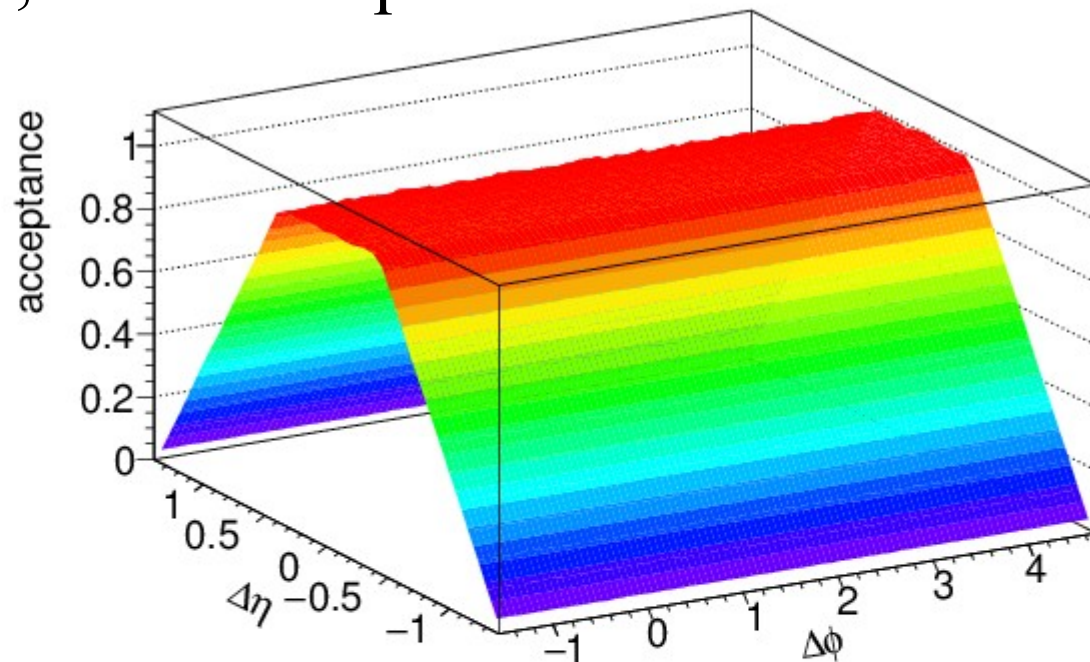
- Use PYTHIA Perugia 2011
- $\pi^\pm$ ,  $K^\pm$ ,  $\bar{p}$ ,  $p$  for unidentified hadrons
- Quarks and gluons as proxy for reconstructed jets



h-h  
 $\sqrt{s} = 2.76$  TeV  
pp collisions  
 $8 < p_T^{\text{trigger}} < 10$  GeV/c  
 $1 < p_T^{\text{assoc}} < 2$  GeV/c

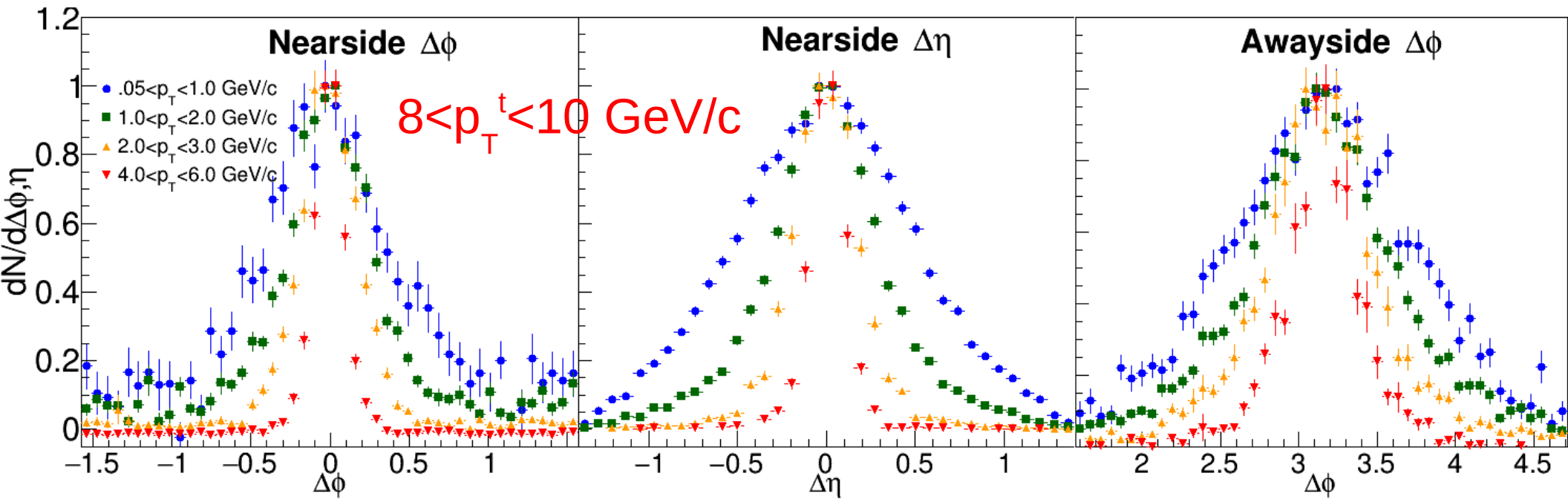
# Acceptance correction

- Fixed acceptance cuts leads to a trivial structure due to acceptance
- This is fixed with a “mixed event” correction
  - Throw random trigger, associated particle within acceptance
  - Calculate  $\Delta\phi$ ,  $\Delta\eta$
  - Use this distribution to correct for acceptance

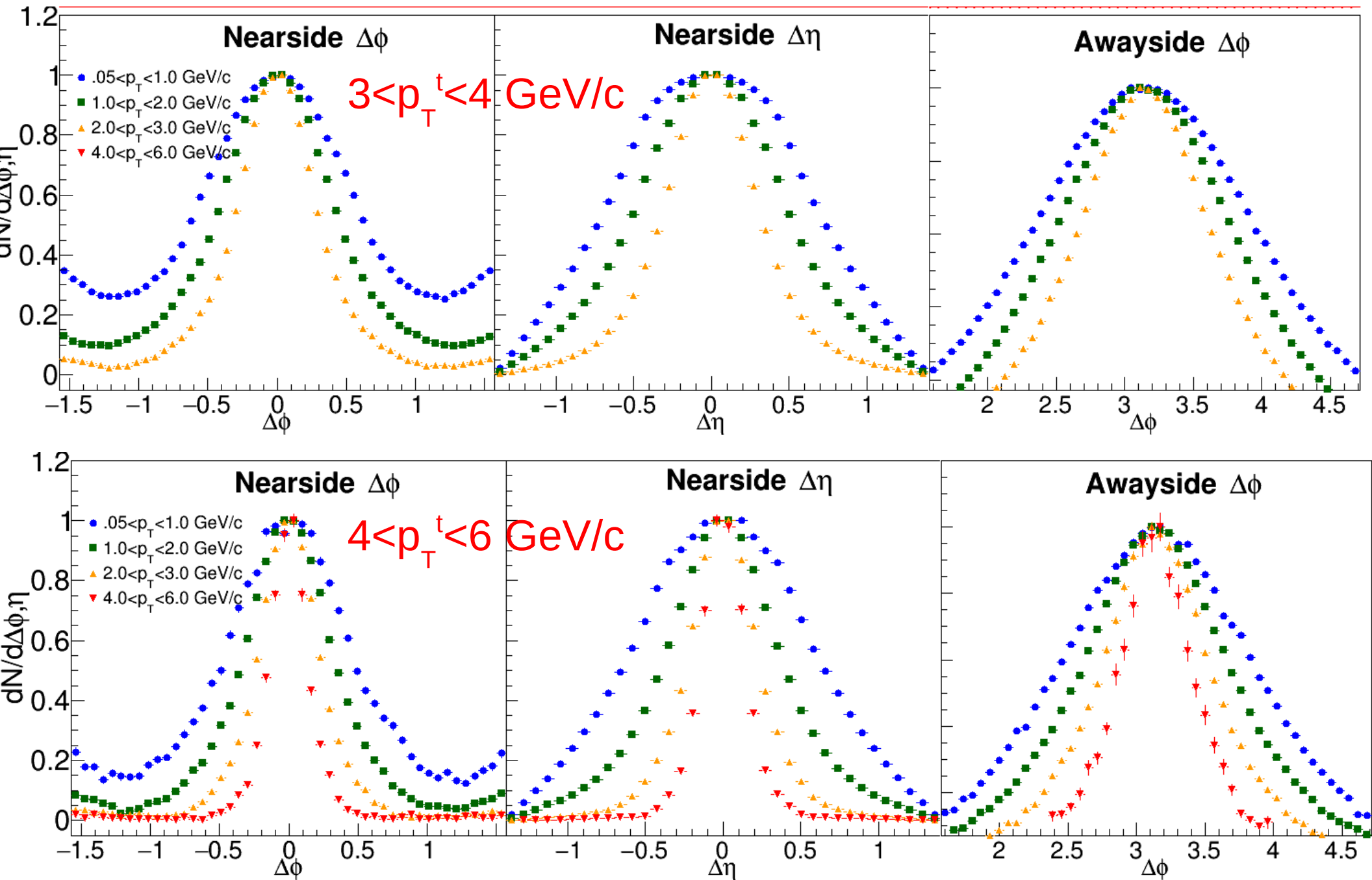




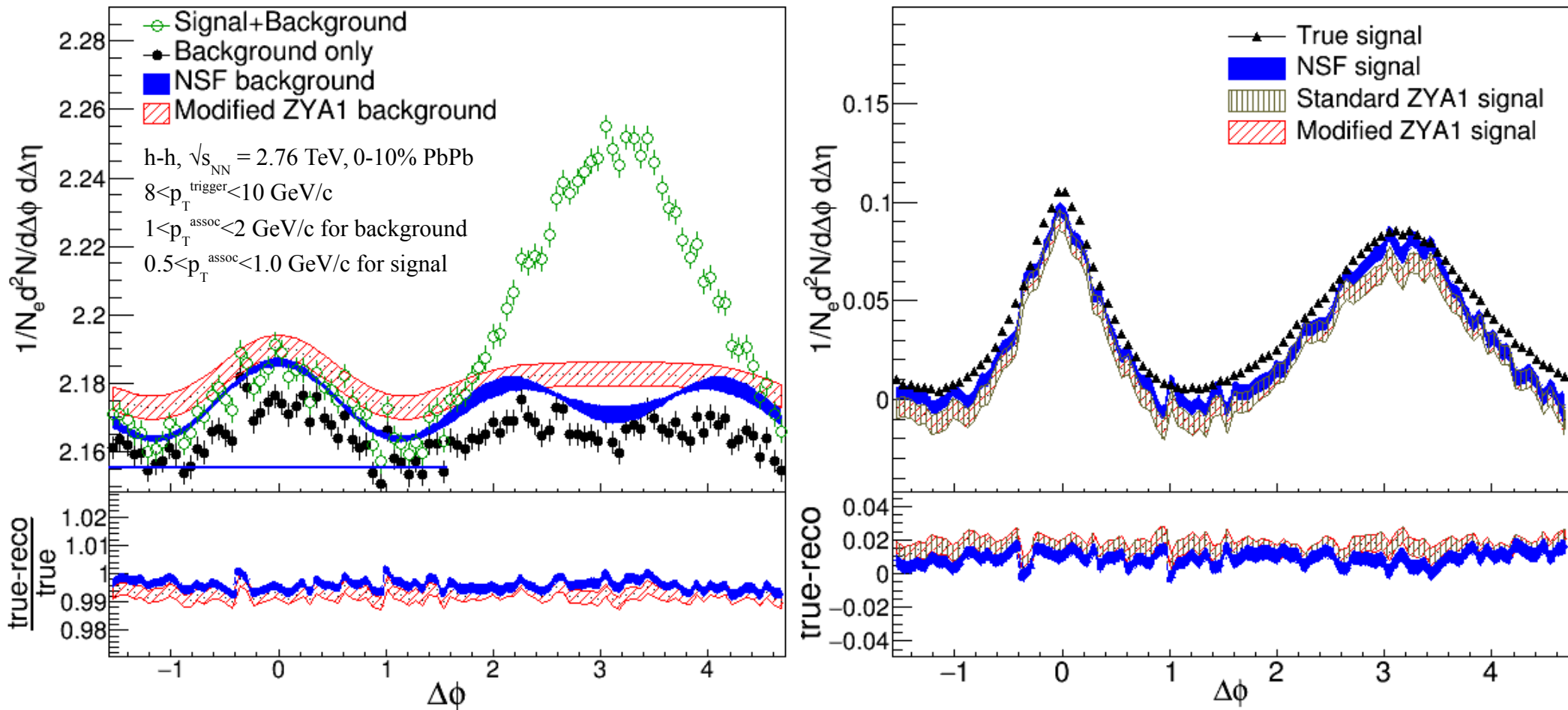
# PYTHIA at 200 GeV



# PYTHIA at 200 GeV



# Near-Side Subtracted NSF method



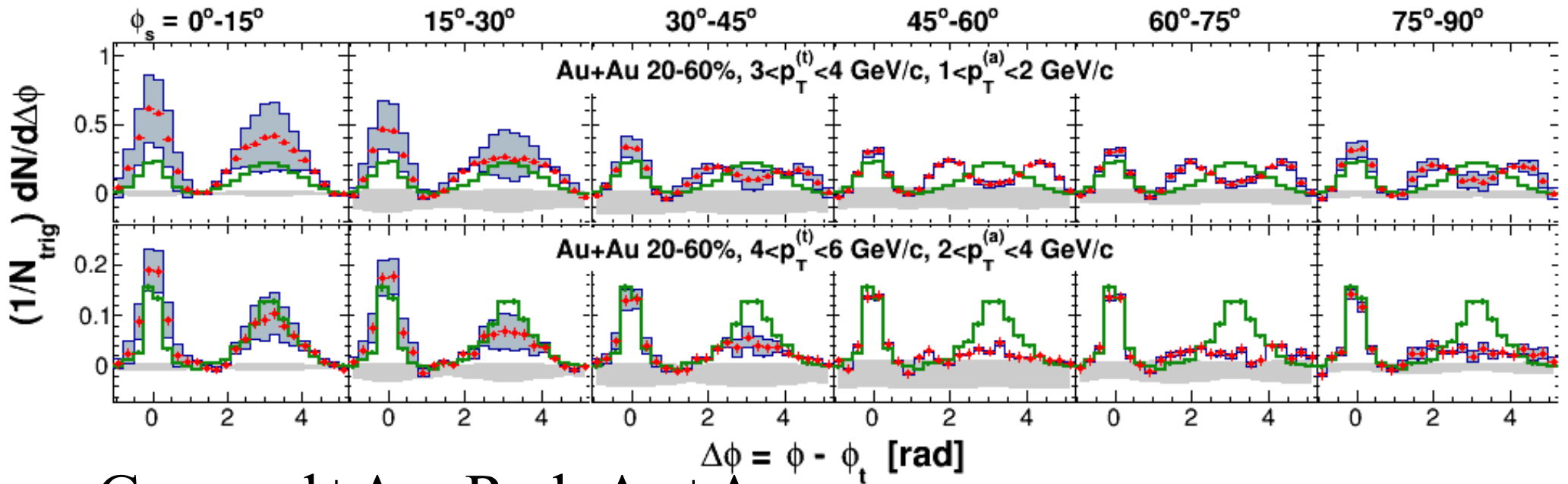
- Project signal+background over  $0.0 < |\Delta\eta| < 1.4$
- Fit background in  $|\Delta\phi| < 1$  including reaction plane dependence
- Bias from residual contamination by near-side

# $v_2$ STAR vs Fit

	$v_2$ STAR (Table I)	$v_2$ Fit (stat. errors only)
$1.5 < p_T < 2.0$ GeV/c	$0.164 \pm 0.011$	$0.194 \pm 0.008$
$2.0 < p_T < 3.0$ GeV/c	$0.189 \pm 0.012$	$0.237 \pm 0.010$
$3.0 < p_T < 4.0$ GeV/c	$0.194 \pm 0.013$	$0.293 \pm 0.058$
$4.0 < p_T < 6.0$ GeV/c	$0.163 \pm 0.020$	$0.073 \pm 0.025$ $0.036 \pm 0.033$ $0.033 \pm 0.068$

- Centrality bin is 20-60% - proper weighting of average?
- Bias in event selection with high  $p_T$  trigger?
- Bias in reconstructed reaction plane in the presence of a jet?
- Residual jet-like signal in background dominated region?
- Less information in fit due to normalization by  $N_{\text{trigger}}$ ?

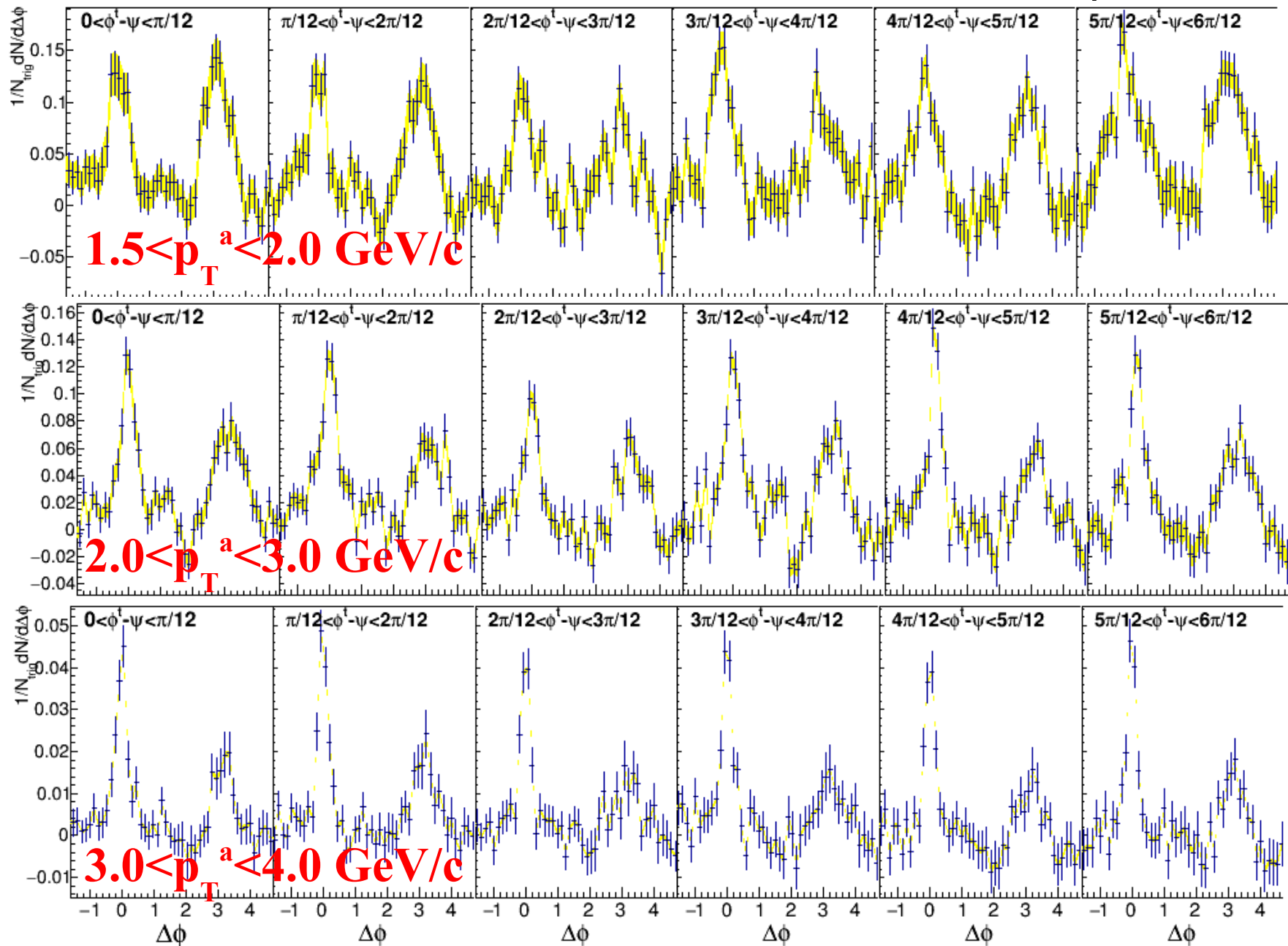
# Correlations - STAR



- Green: d+Au, Red: Au+Au
- Large error bars
- “Mach Cone” evident, even decrease in amplitude for higher  $p_T^t$

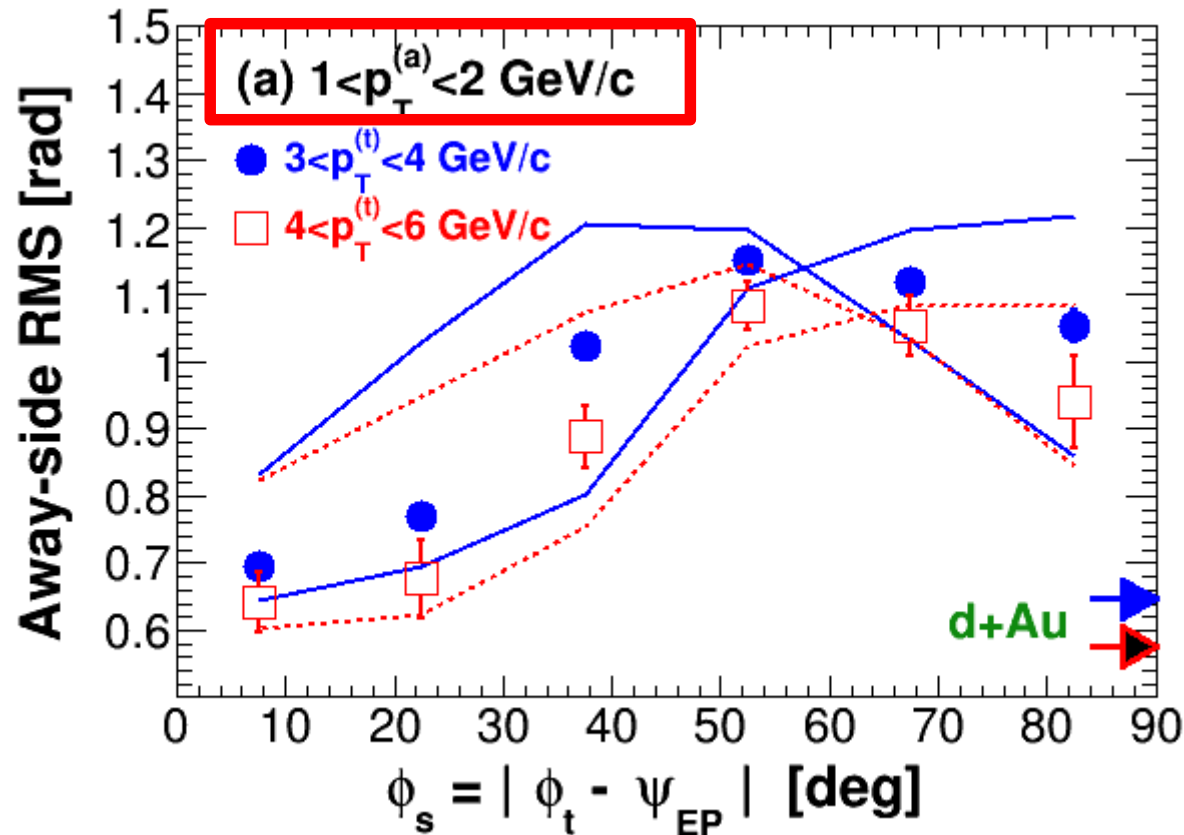


# Background subtracted correlations $4 < p_T^t < 6 \text{ GeV}/c$

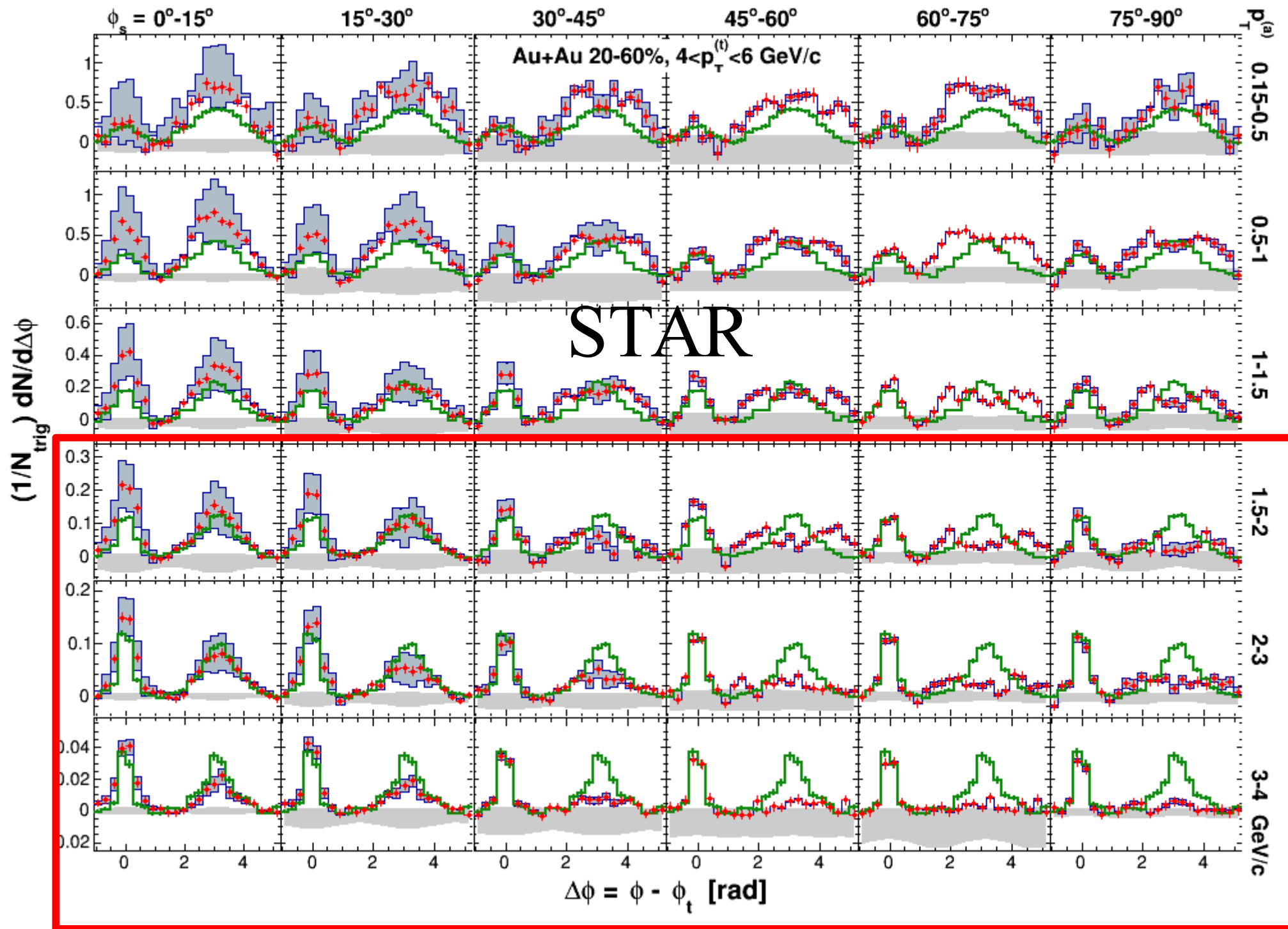


**No “Mach Cone”**

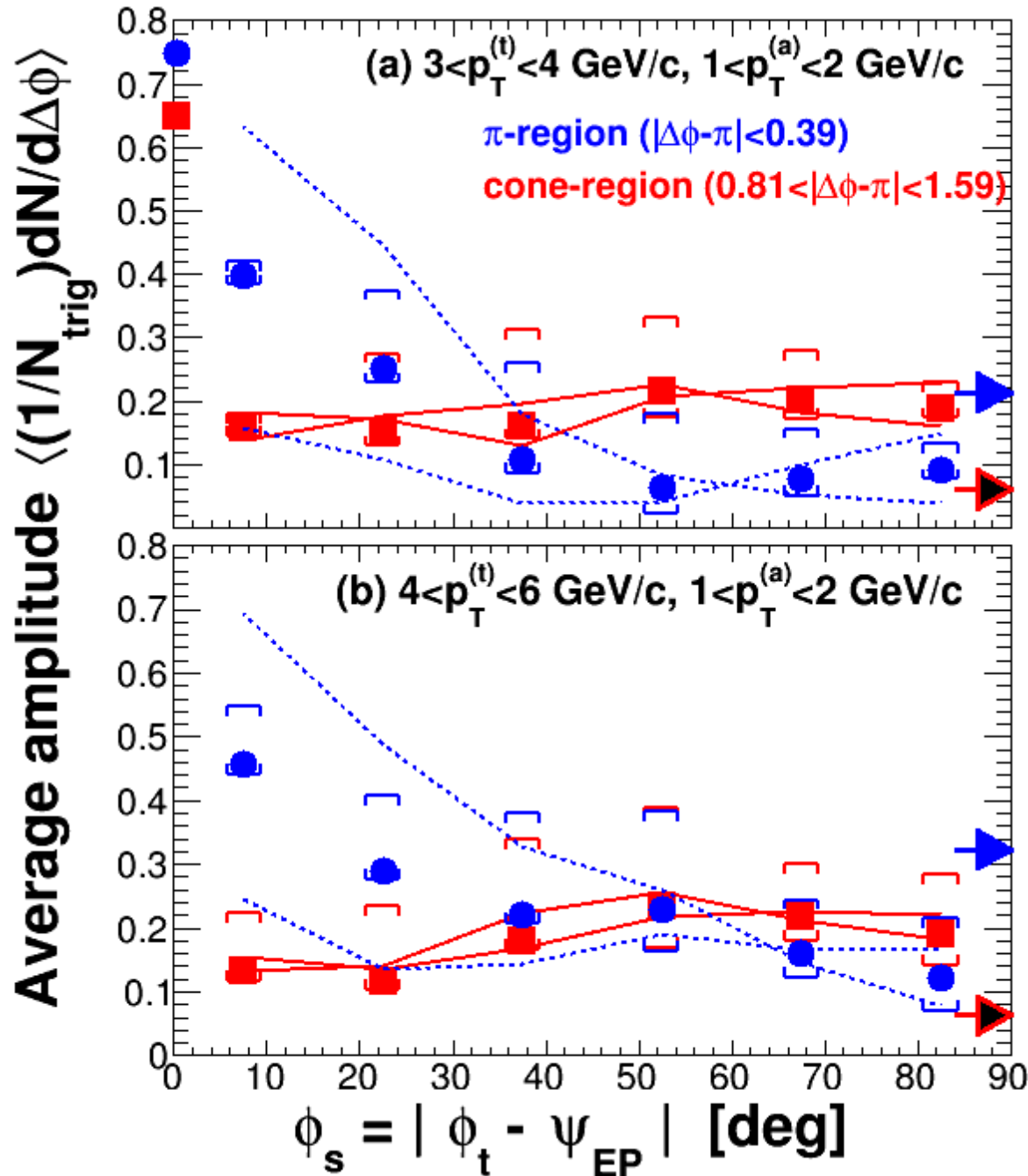
# RMS - STAR



- Large error bars (shown as lines)
- Strong reaction plane dependence



# Yields – STAR

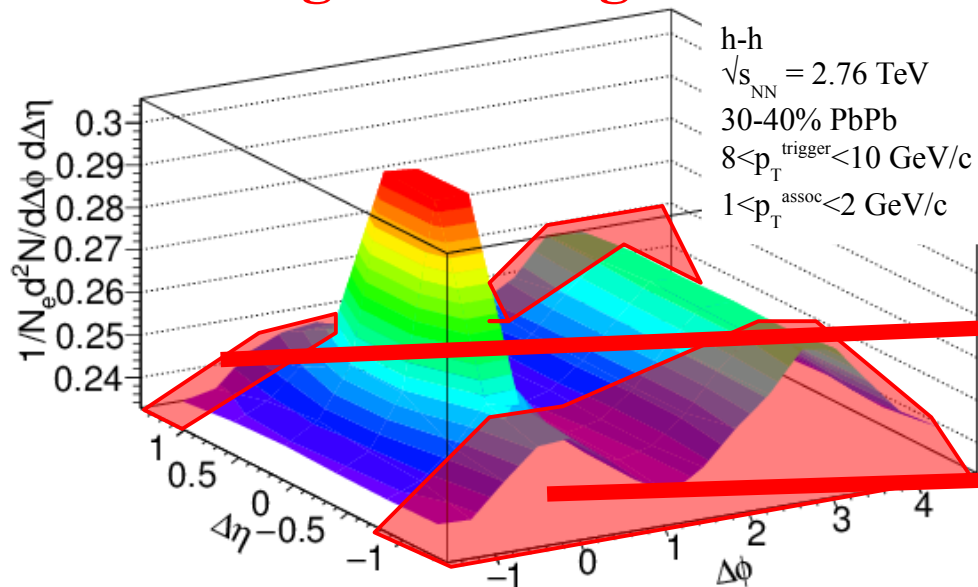


- Large error bars (shown as lines)
- Indications of reaction plane dependence?

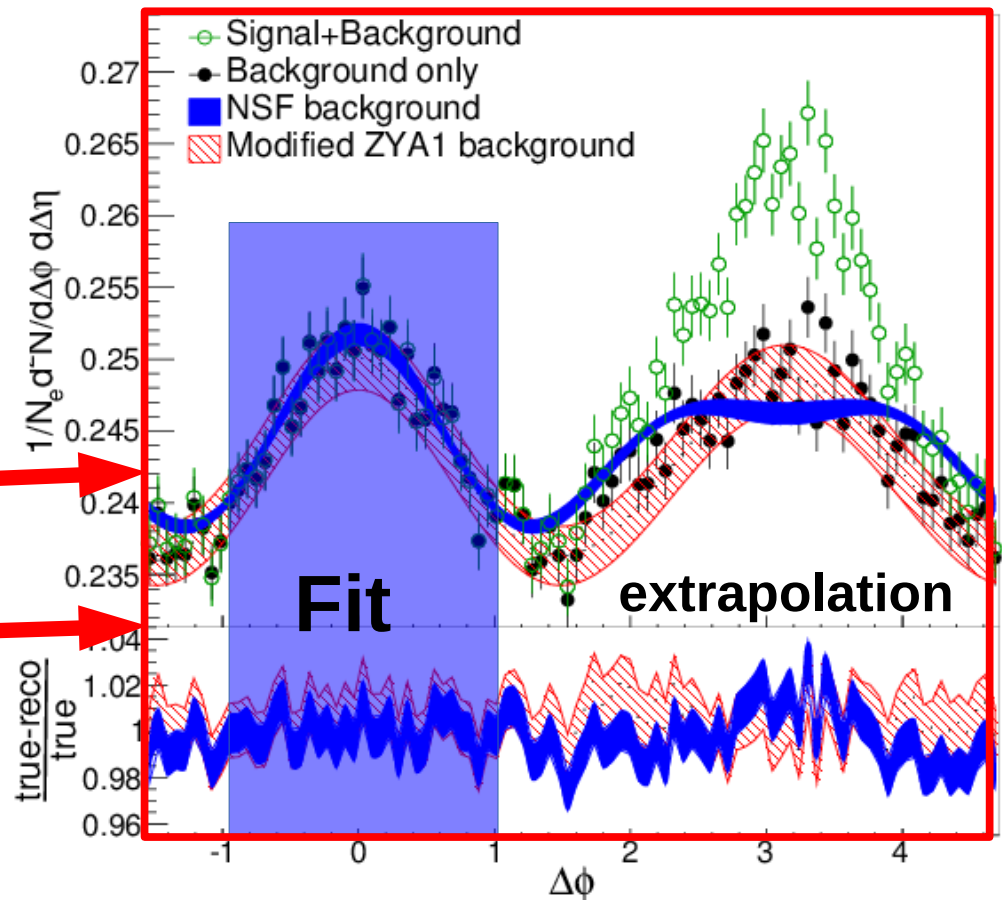
# Near-Side Fit (NSF) method

No reaction plane dependence

**Signal+background**



**Background dominated region**



- Project signal+background over  $1.0 < |\Delta\eta| < 1.4$
- Fit background in  $|\Delta\phi| < 1$
- **Not reliable over narrower  $\Delta\phi$  region**